

## Definitions

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- A mobile robot is a structure capable to move and act (autonomously or remotely operated) in terrestrial, underwater or aerial environments
- Environments can be assumed to be
  - totally structured, partially structured or unstructured
  - totally known, partially known or unknown
- Structured environment = one knows the type and the geometric characteristics of the environment
  - office space: corridors, doors, chairs, tables, etc.
  - obstacles: static or dynamics or both
  - constant or slow-varying in time

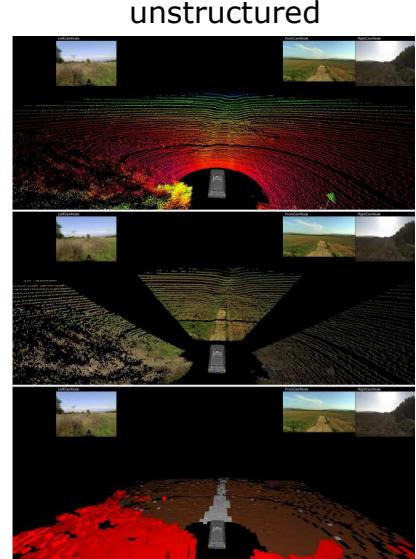
## Autonomy

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- Autonomy is the ability to move independently from a human supervisor
- It requires
  - Intelligence, i.e.,
    - CPU, algorithms, database
    - onboard or “in the cloud”
  - Sensors (for perceiving the environment)
  - Actuators (for motion and manipulation, etc.)
  - Energy source:
    - onboard generated
    - or supplied by an “umbilical cord”

# Examples

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## Fundamental problems in mobile robotics

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- **Locomotion**: how the robot moves in the environment
- **Perception**: how the robot perceives the environment
- **Representation**: how the robot organizes the knowledge about the environment
- **Mapping**: how to build the map of the environment
- **Localization**: where is the robot in the map
- **Path planning/action planning**: what the robot shall do to go from here to there; what are the actions to be performed to complete a specified task
- **Supervision and control**: how are the command to actuators generated to perform simple or complex tasks. How to generate tasks

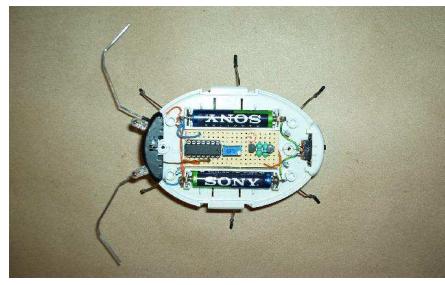
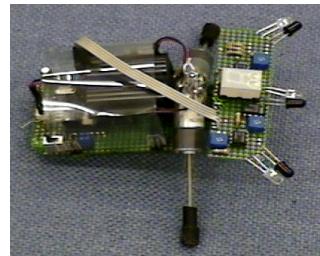
# Locomotion

- Terrestrial robots
  - Wheeled
  - Legged
  - Mixed wheels/legs
  - Biped (humanoids)
  - Others (biomimetics = imitation of natural locomotion)
- Underwater robots
  - Propellers
  - Water jets
- Aerial robots
  - Fixed wings
  - Rotating wings (helicopters and quadcopters)
  - Airships and dirigibles
  - Flapping wings

## Terrestrial Robots – wheeled



## Terrestrial Robots – legged

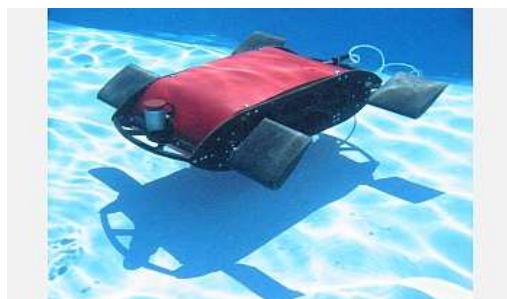


## Terrestrial Robots – “humanoids”



# Underwater Robots

- To move they use
  - Propellers
  - Water jets
  - Fins or entire body motion



# Aerial robots (UAV)

- Airship (lighter than air) or aircrafts (heavier than air)
- They use
  - Propellers
  - Rotating wings
  - Flapping wings



# Natural Locomotion

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Locomotion types



Longitudinal waves



Transversal waves



Running



Jumping



Step

## Biomimetic systems

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Nature imitation



Longitudinal waves

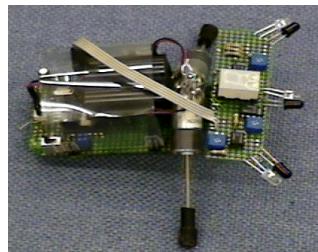
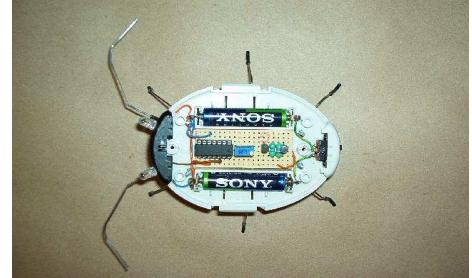


Transversal waves

# Biomimesis

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Copy from nature



## Mobile Robots: topics treated

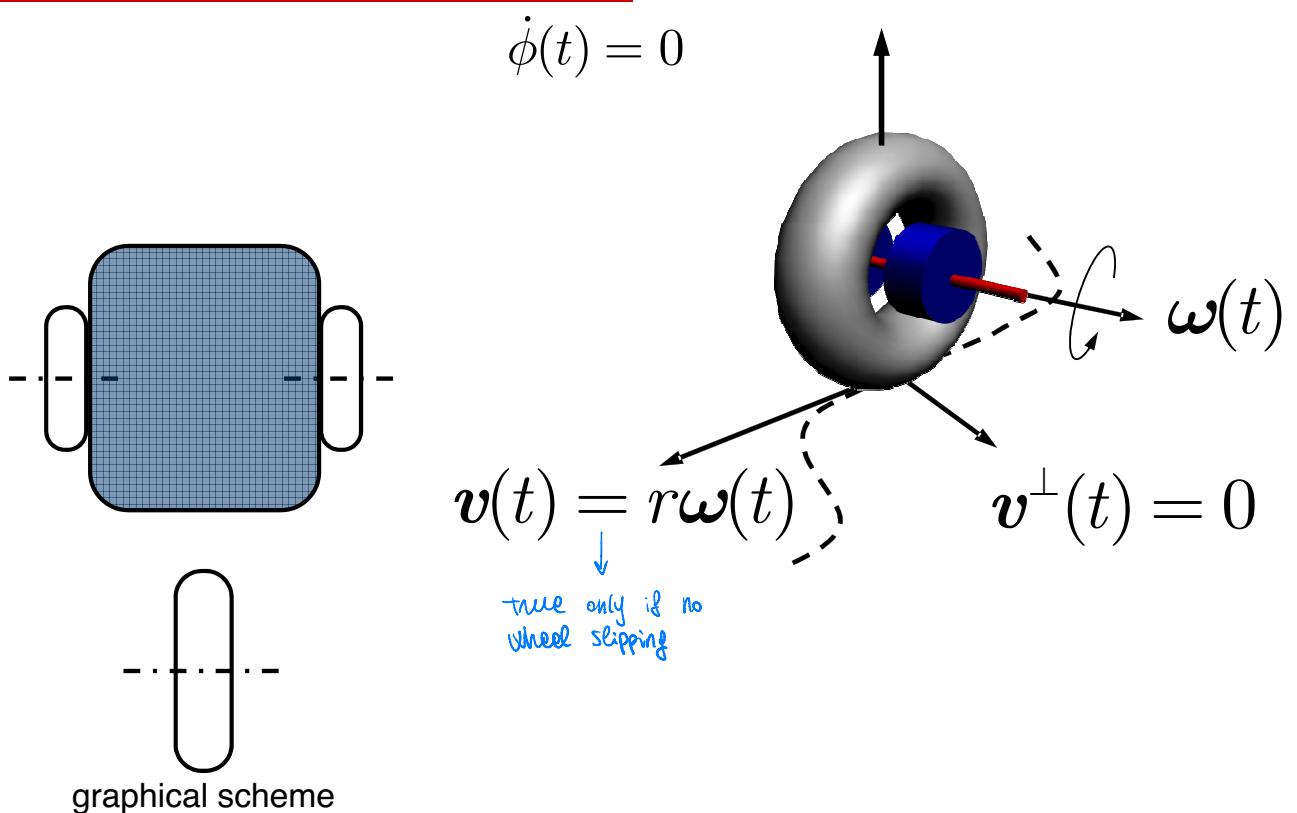
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- Wheeled robots
- Kinematics
- Sensors
  - Absolute and relative position (odometry)
  - Speed
  - Proximity and distance
  - Active ranging
  - Vision
- Intelligence

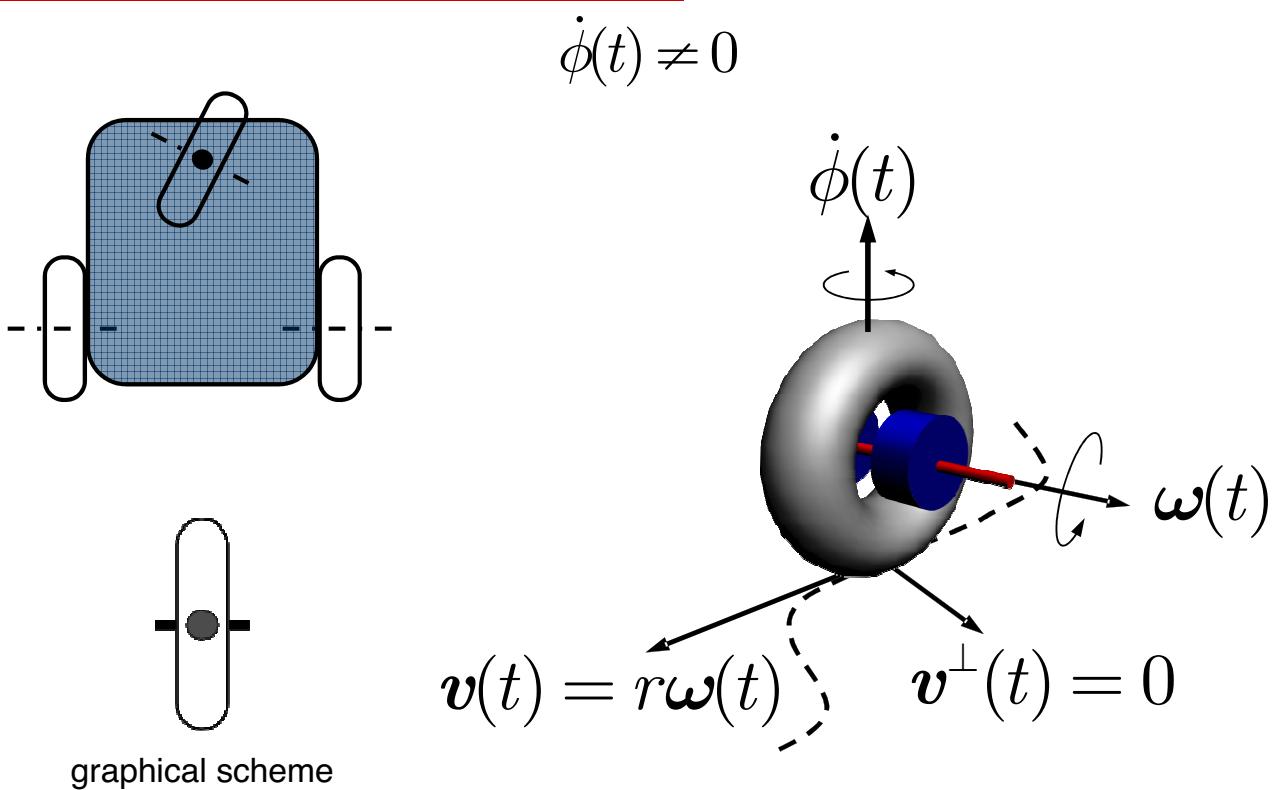
# Wheel Types

- Simple non steering wheels
- Simple steering wheels
- Castor wheel
- Omniwheel (omnidirectional wheel) or Swedish wheel
- Spherical omniwheel
  
- Wheel may be active or passive

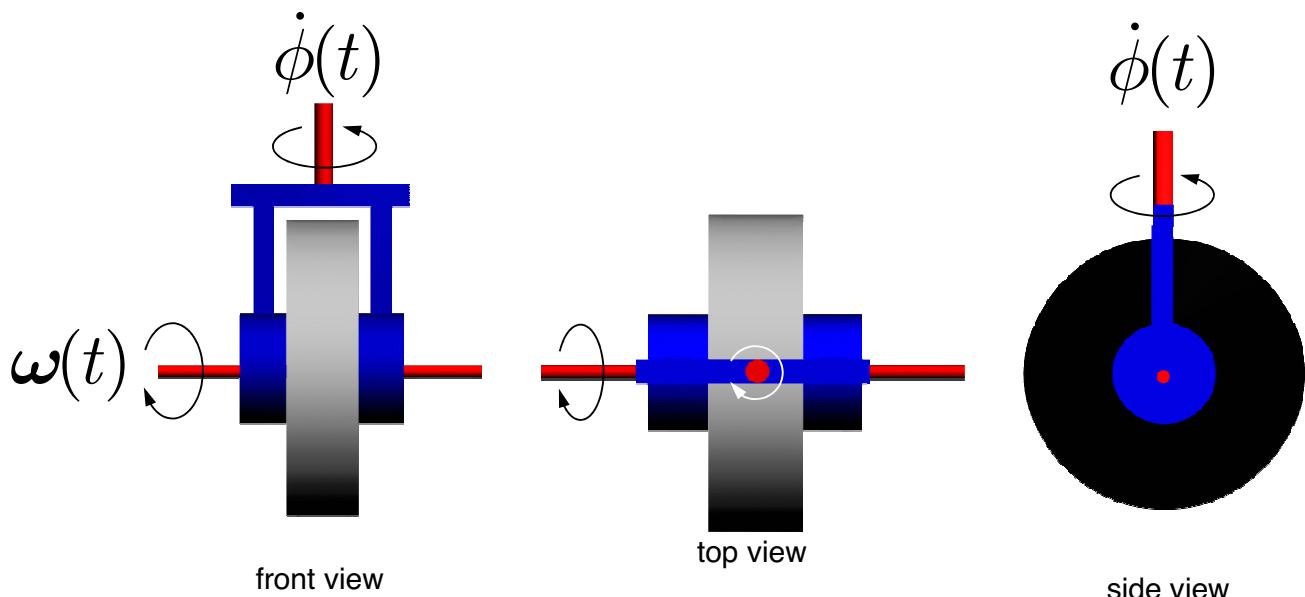
## Simple non steering wheel



## Simple steering wheel



## Simple steering wheel



## Castor Wheel

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## Omniwheel

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# Omniwheel

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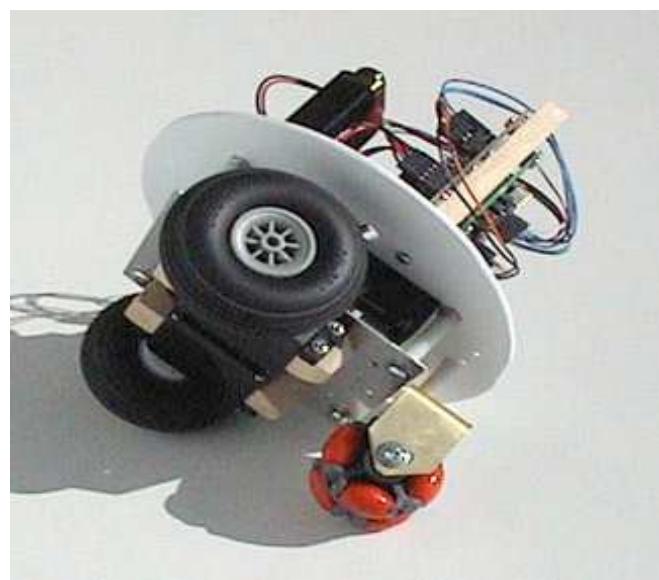


Industrial platforms  
with omniwheels



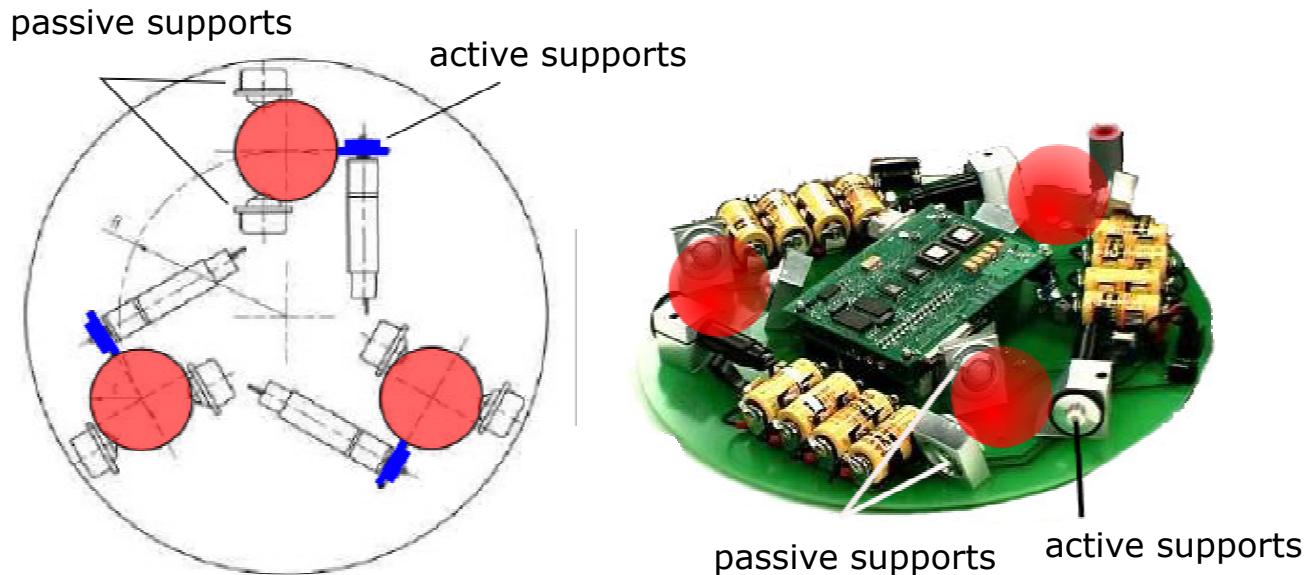
# Omniwheel

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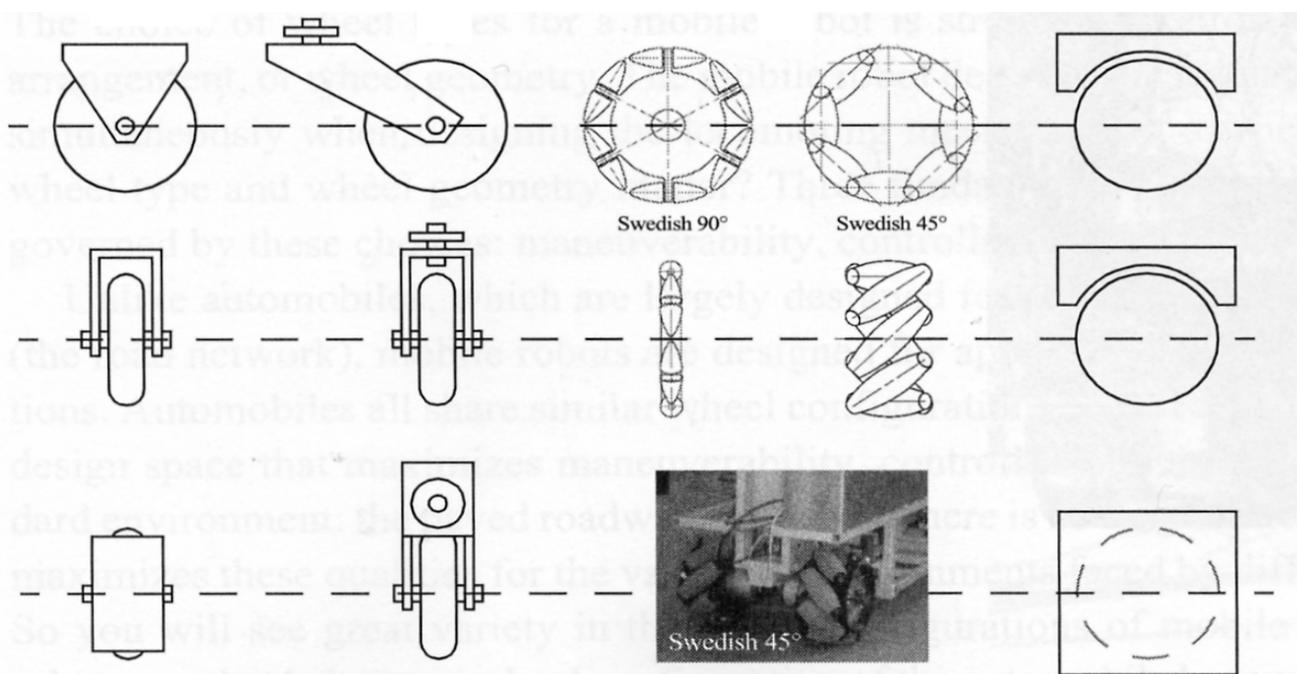


Omniwheel can also be used as a support in a differential drive robot

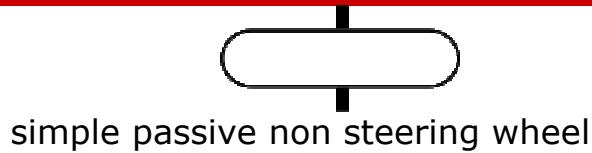
# Omnidirectional Spherical Wheel



## Wheels Symbols



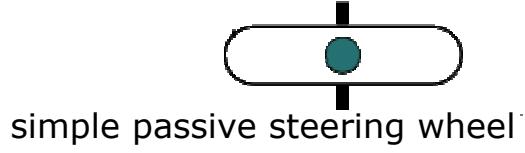
# Wheels Symbols



simple passive non steering wheel



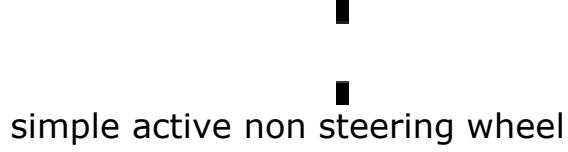
passive castor wheel



simple passive steering wheel



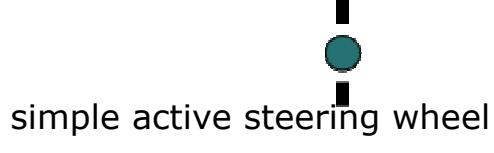
active castor wheel



simple active non steering wheel



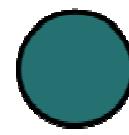
omnidirectional wheel



simple active steering wheel



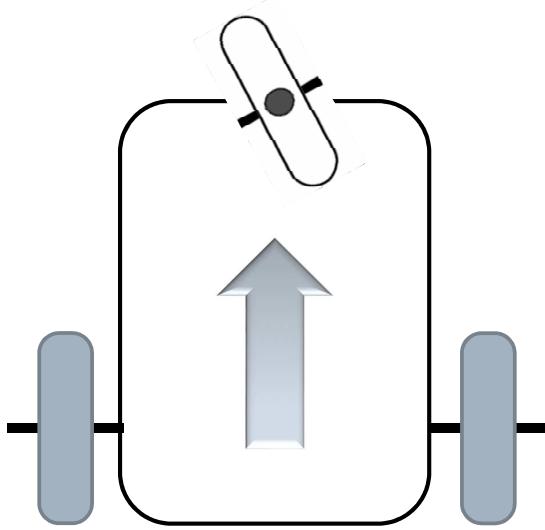
passive spherical wheel



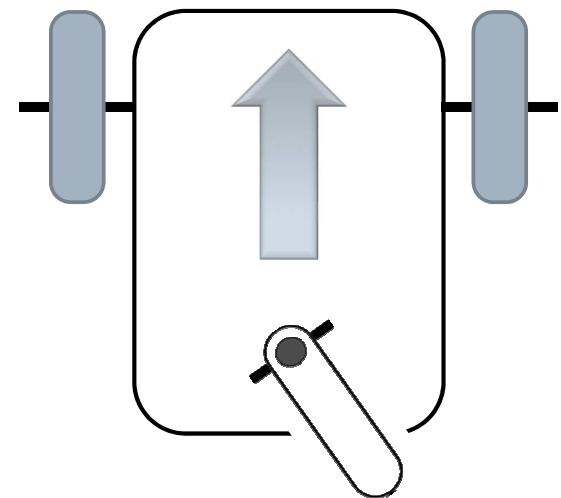
active spherical wheel

## Typical structures

Active fixed wheels + steering wheel



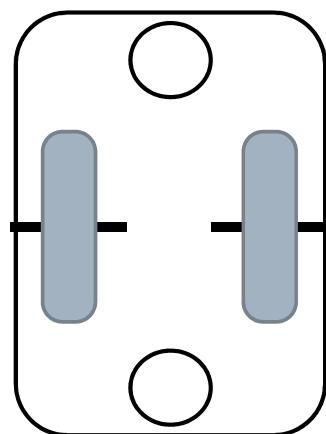
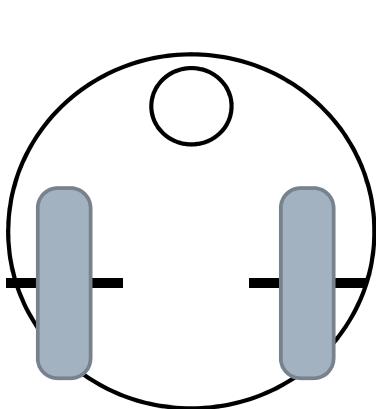
Active fixed wheels + castor passive wheel



## Typical structures

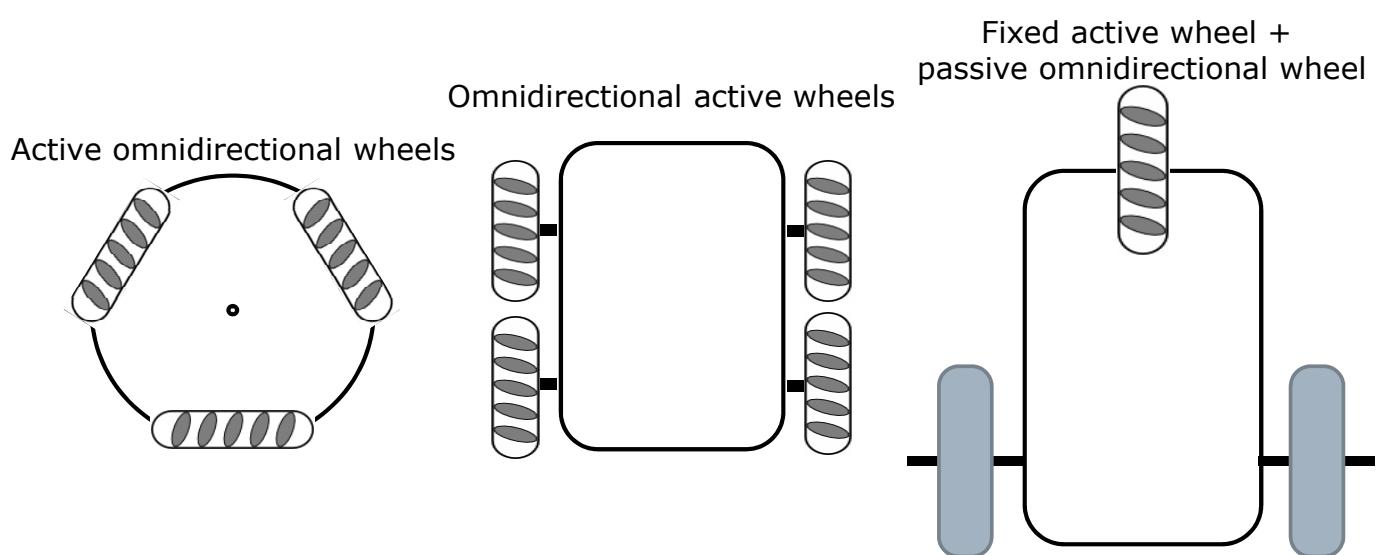
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Differential wheels + passive spherical wheels

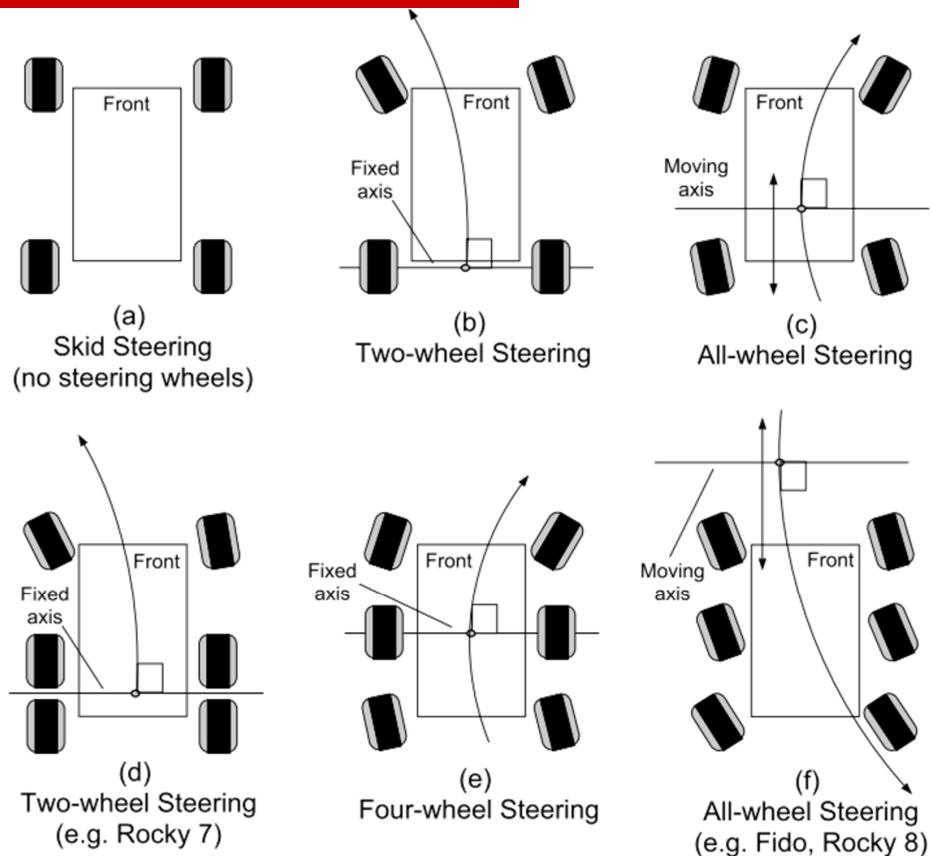


## Typical structures

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# Steering



# Steering

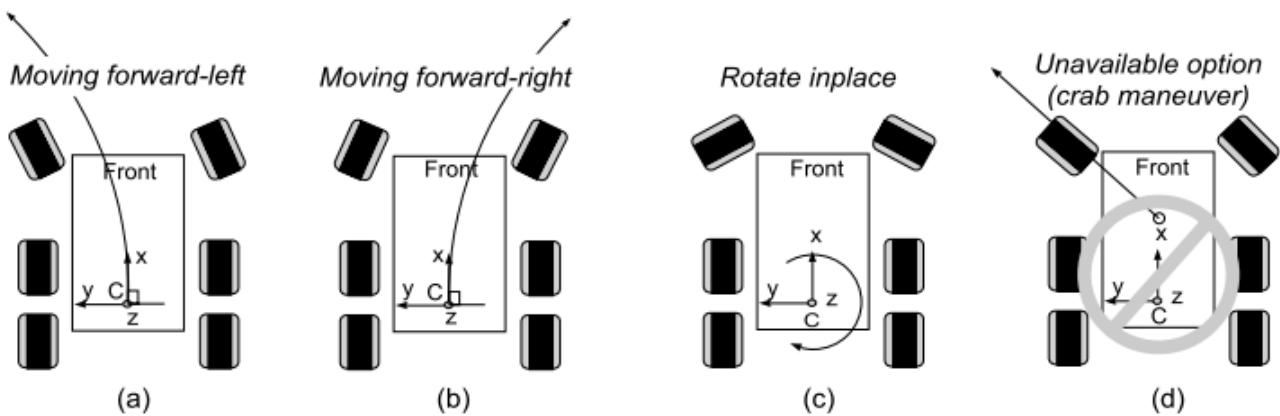


Fig. 2. The mobility of a six-wheel rover with two-wheel front steering (e.g. *Rocky 7*)

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***Robotics***

***Mobile robots***

**Part 1: Constraints and Kinematic Models**

# Kinematics and Constraints

- Wheeled vehicles are subject to **constraints** that limit the local mobility, without preventing (in general) the possibility of attaining arbitrary poses

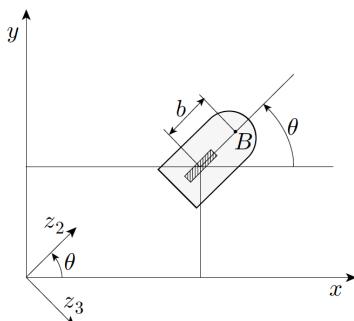
■ *Think about parking your car: you can't move sideways, but you can do parallel parking with a suitable sequence of maneuvers!*



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## Constraints

- Let  $\mathbf{q} \in \mathbb{R}^n$  the vector **generalized coordinates** that describes the **configuration** of the robot and assume for the moment that the **configuration space  $\mathcal{C}$**  (the set of all possible robot configurations) coincides with  $\mathbb{R}^n$ 
  - For example in the case of a **unicycle** (single steered wheel) we have  $\mathbf{q} = [x \ y \ \theta]^T$ , where  $(x, y)$  are the coordinate of the contact point of the wheel and  $\theta$  the wheel angle w.r.t. an axis
- The robot motion is described by  $\mathbf{q}(t)$  and can be subject to constraints



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# Constraint Classification

e.g.

$$x(t) - 2\theta(t) = 0 \rightarrow \text{bilateral and scleronomic}$$

$$x(t) - 2\theta(t) + 3t = 0 \rightarrow \text{bil. and Reconomic}$$

i.e. time-Variant vs time-invariant parameters

- Constraints can be expressed by

- equalities  $\rightarrow$  **bilateral** constraints =
- inequalities  $\rightarrow$  **unilateral** constraints <

they can explicitly depend on time (**reconomic** constraints)  
or being independent from it (**scleronomic** constraints)

→ We will only deal with **bilateral and scleronomic constraints**, that is, represented by equalities in which the time does not explicitly appear

- We call **holonomic** (or **integrable**) those constraints that can be written as

$$h_i(\mathbf{q}) = 0, \quad i = 1, \dots, k < n$$

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## Holonomic Constraints

e.g. if  $x - 2\theta = 0$  (Holonomic) and  
 $\mathbf{q} = (x, y, \theta) \Rightarrow q(x, y) = q(\theta, y) \Rightarrow$  one dim.  
 is removed from  $\mathbf{q}$  thanks to the constraint

- A system with all holonomic constraints is called a **holonomic system**
- The effect of holonomic constraints is to reduce the space of the accessible configurations to a subspace  $\mathcal{C}$  with dimension  $n - k$ 
  - The existence of  $k$  holonomic constraints leads to the elimination of  $k$  generalized coordinates, which can be expressed as functions of the other  $n - k$  (implicit function theorem)  $\Rightarrow$  implicit function thm.
  - This procedure may lead to singularities. Alternatively, we can define a new, reduced set of  $n - k$  coordinates, directly defined on the accessible subspace

they PRODUCE limits ON the CONFIGURATIONS (e.g. RAILS of a TRAIN)

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## Kinematic constraints

e.g.  $x + 2\dot{x} = 0 \Rightarrow \frac{dx}{dt} = -\frac{x}{2}$

limits the motion, not the config.  
(holonomic constr. limit the configuration)

- The constraints that involve both the generalized coordinates and their derivatives (velocities) are called **kinematic constraints** and, in general, they are expressed as

$$a_i(\mathbf{q}, \dot{\mathbf{q}}) = 0, \quad i = 1, \dots, k < n$$

- Kinematic constraints limit the admissible instantaneous motion of the system, constraining the set of generalized velocities that can be obtained in each configuration
- Kinematic constraints can be often written in **Pfaffian form**, that is, they are **linear in the generalized velocities**

(in matrix form)

$$\mathbf{A}^T(\mathbf{q})\dot{\mathbf{q}} = \mathbf{0}$$

↓ e.g.  
[3x + y] \dot{x} = 0

this limits ONLY the motion (like a car that CANNOT move sideways)<sup>6</sup>

## Holonomic and nonholonomic constraints

- The existence of  $k$  holonomic constraints implies the existence of  $k$  kinematic constraints → Derivi un Holonomic CONSTR. e ottieni un KINEM. CONSTR.

$$\frac{dh_i(\mathbf{q})}{dt} = \frac{dh_i(\mathbf{q})}{d\mathbf{q}} \dot{\mathbf{q}} = 0, \quad i = 1, \dots, k$$

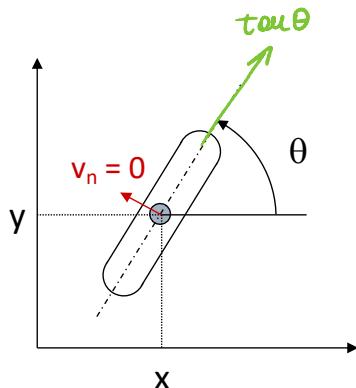
Abbiamo una  
derivate, vogliamo  
"TORNARE INDIETRO"

- The contrary is not true in general, since kinematic constraints can be reduced to holonomic constraints only if they are integrable. If not, they are called **nonholonomic** or **non-integrable**

- A system with at least a nonholonomic constraint is called **nonholonomic system**
- Nonholonomic constraints do not imply any loss of accessibility in  $\mathcal{C}$  (the number of generalized coordinates cannot be reduced), while velocities are constrained over a subspace of dimension  $n - k$

## Example of nonholonomic constraint

- Q HOLOnomic CONSTRA. → CAN be in ANY configuration
- A unicycle rolls **without slipping** on a horizontal plane



$$\mathbf{q} = [x \ y \ \theta]^T$$

(x, y) are the coordinates of the point of contact with the plane,  $\theta$  is the wheel angle w.r.t. the x axis, the wheel rotation angle  $\phi$  is not influent for our analysis

- The **pure rolling constraint** implies that the velocity of the contact point cannot have nonzero components along the normal direction to the wheel plane

$$\frac{dy}{dx} = \tan \theta$$

i.e. it CAN ONLY move along the direction  $\tan \theta$  (because of the orientation of the wheel)

## Example of nonholonomic constraint

CONT.

- Such a constraint can be expressed in Pfaffian form through:

chain rule

$$\frac{dy}{dx} = \frac{dy}{dt} \cdot \frac{dt}{dx} = \frac{\dot{y}}{\dot{x}} = \frac{\sin \theta}{\cos \theta} \Rightarrow \dot{y} \cos \theta = \dot{x} \sin \theta$$

$$\Rightarrow \dot{x} \sin \theta - \dot{y} \cos \theta = 0 \Rightarrow [\sin \theta \ -\cos \theta \ 0] \dot{\mathbf{q}} = 0$$

$$\dot{\mathbf{q}} = \begin{bmatrix} \dot{x} \\ \dot{y} \\ \dot{\theta} \end{bmatrix}$$

NON INTEGRABLE

- The constraint is **nonholonomic**, since it does not imply any loss of accessibility in the wheel configuration space  
⇒ It is possible to displace the wheel from any initial configuration  $\mathbf{q}_i$  to any final configuration  $\mathbf{q}_f$  through a suitable sequence of motions that do not violate the pure rolling constraint

## Kinematic model

e.g.  $\underbrace{[\cos\theta \sin\theta 0]}_{A^T} \dot{q} = 0$

- Form the matrix formulation of the kinematic constraints

$$A^T(q)\dot{q} = 0$$

it is evident that the  $(n - k)$  admissible generalized velocities belong to the null space of  $A^T(q)$  ↪ i.e. All velocities  $\dot{q}$  that satisfy our constraint  $A^T(q)\dot{q} = 0$

$$\dot{q} \in N(A^T(q))$$

- Denoting with  $\{g_1(q), \dots, g_{n-k}(q)\}$  a base of  $N(A^T(q))$ , it is possible to define the admissible trajectories as the solution of the nonlinear dynamical system

$$\dot{q} = \sum_{j=1}^m g_j(q)u_j = G(q)u, \quad m = n - k$$

that represents the kinematic model of the constrained system

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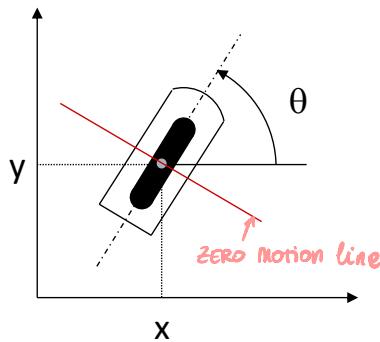
## Kinematic model

- Vector  $q$  represents the **state vector** of the system, while  $u = [u_1 \dots u_m]^T$  is the **input vector**
- The obtained system is said to be **driftless**, since a null input causes  $\dot{q} = 0$
- The choice of the **vectorial input fields**  $g_j(q)$ , is not unique and, consequently, also the choice of input  $u$  is not unique
  - The components of  $u$  can either have a physical interpretation and/or be related to the available control input, or not

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## Kinematic model of a unicycle

- Let us consider a **unicycle**, a vehicle with a single steerable wheel



*seen in Prev. example*

The configuration is described by

$$\mathbf{q} = [x \ y \ \theta]^T$$

and the pure rolling constraint is  
 $\dot{x} \sin \theta - \dot{y} \cos \theta = 0 \Rightarrow [\sin \theta \ -\cos \theta \ 0] \dot{\mathbf{q}} = 0$

- The line passing by the contact point of the wheel and orthogonal to the direction of motion is called **zero motion line**

- A base of the null space of the constraint matrix is given by:

$$\mathbf{g}_1(\mathbf{q}) = [\cos \theta \ \sin \theta \ 0]^T, \quad \mathbf{g}_2(\mathbf{q}) = [0 \ 0 \ 1]^T$$

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## Kinematic model of a unicycle

CONT.

- Thus, we have:

$$\mathbf{G}(\mathbf{q}) = \begin{bmatrix} \cos \theta & 0 \\ \sin \theta & 0 \\ 0 & 1 \end{bmatrix}$$

and, correspondingly, the **unicycle kinematic model** is given by

$$\begin{bmatrix} \dot{x} \\ \dot{y} \\ \dot{\theta} \end{bmatrix} = \begin{bmatrix} \cos \theta \\ \sin \theta \\ 0 \end{bmatrix} v + \begin{bmatrix} 0 \\ 0 \\ 1 \end{bmatrix} \omega$$

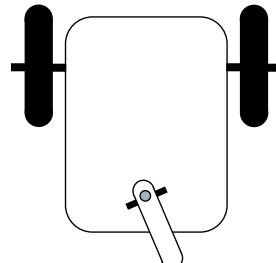
In this case the inputs have a physical meaning and are related to straightforward control inputs:  $v$  is the **driving velocity** (modulus of the velocity of the contact point) and  $\omega$  is the **steering velocity**

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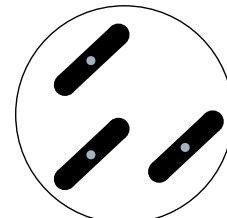
## Equivalence between the unicycle and other structures

- A unicycle would not be practically useful, due to its balancing problems. From a kinematic point of view, however, it is equivalent to more stable structures, such as

- Differential drive vehicle



- Synchro drive vehicle



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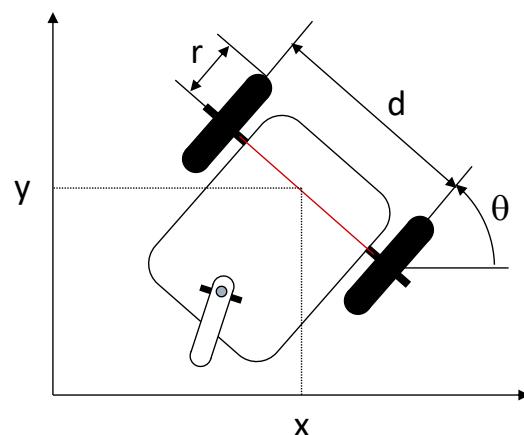
## Equivalence with the differential drive

- The «physical» inputs are the rotation velocities of the two wheels,  $\omega_R$  and  $\omega_L$
- There exists a direct correspondence between such input and the ones of the unicycle (drive velocity  $v$  and steering velocity  $\omega$ )

$$v = \frac{r(\omega_R + \omega_L)}{2}$$

$$\omega = \frac{r(\omega_R - \omega_L)}{d}$$

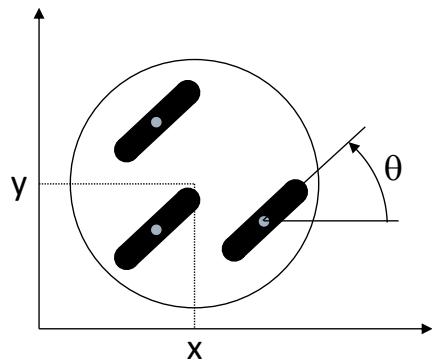
$(x, y)$  are the coordinates of the middle point of the wheel axis,  $\theta$  the vehicle heading



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## Equivalence with a synchro drive vehicle

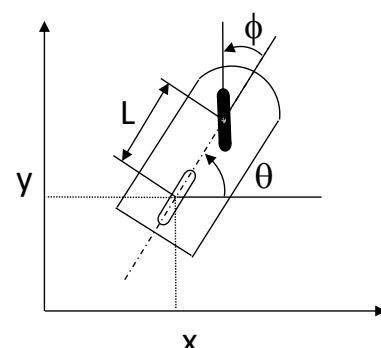
- The equivalence is straightforward, since both drive and steer velocity are common to the three wheels
  - Coordinates  $(x, y)$  can represent here any point of the chassis, while  $\theta$  is the wheels heading (the chassis has constant heading)



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## Kinematic model of a bicycle

- Let us consider a **bicycle**, that is a vehicle with a steered wheel and a fixed one, mounted at a distance  $L$ 
  - Possible choice for the generalized coordinates:
  - $(x, y) \rightarrow$  coordinates of the contact point of the rear wheel
  - $\theta \rightarrow$  heading of the vehicle w.r.t. x
  - $\phi \rightarrow$  steering angle of the front wheel



$$\mathbf{q} = [x \quad y \quad \theta \quad \phi]^T$$

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## Kinematic model of a bicycle

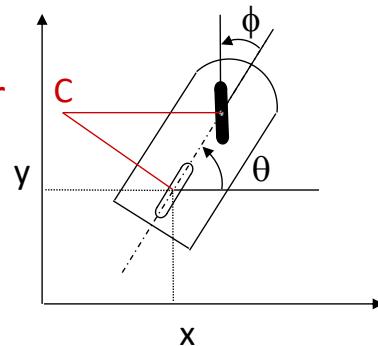
- There exist **two pure rolling constraints**, one for each wheel

*front wheel*  $\rightarrow \dot{x}_f \sin(\theta + \phi) - \dot{y}_f \cos(\theta + \phi) = 0$

*rear wheel*  $\rightarrow \dot{x} \sin \theta - \dot{y} \cos \theta = 0 \rightarrow$  *same as unicycle*

where  $(x_f, y_f)$  are the coordinates of the center of the rear wheel

- The two motion lines intersect in a point C called **instantaneous center of rotation**
  - The position of C depends only on  $\mathbf{q}$
  - Every point of the chassis moves instantaneously along a circumference arc centered in C



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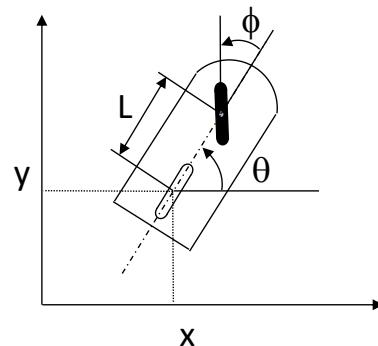
## Kinematic model of a bicycle

- The coordinates  $(x_f, y_f)$  of the center of the front wheel can be expressed as a function of those of the rear wheel, using the rigid body constraint

*|*  $x_f = x + L \cos \theta$   
*|*  $y_f = y + L \sin \theta$

- After some algebra, the first pure rolling constraint can be expressed as:

$$\dot{x} \sin(\theta + \phi) - \dot{y} \cos(\theta + \phi) - L \dot{\theta} \cos \phi = 0$$



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## Kinematic model of a bicycle

- Matrix form of the constraint  $\mathbf{A}^T(\mathbf{q})\dot{\mathbf{q}} = \mathbf{0}$

$$\mathbf{A}^T(\mathbf{q}) = \begin{bmatrix} \sin \theta & -\cos \theta & 0 & 0 \\ \sin(\theta + \phi) & -\cos(\theta + \phi) & -L \cos \phi & 0 \end{bmatrix}$$

- The rank of  $\mathbf{A}^T$  is 2 and, consequently, its null space has dimension  $4 - 2 = 2$ . A possible base for  $N(\mathbf{A}^T(\mathbf{q}))$  is formed by the columns of

$$\mathbf{G}(\mathbf{q}) = \begin{bmatrix} \cos \theta \cos \phi & 0 \\ \sin \theta \cos \phi & 0 \\ \frac{\sin \phi}{L} & 0 \\ 0 & 1 \end{bmatrix}$$

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## Kinematic model of a bicycle

- With this choice the kinematic model is

$$\begin{bmatrix} \dot{x} \\ \dot{y} \\ \dot{\theta} \\ \dot{\phi} \end{bmatrix} = \begin{bmatrix} \cos \theta \cos \phi \\ \sin \theta \cos \phi \\ \frac{\sin \phi}{L} \\ 0 \end{bmatrix} u_1 + \begin{bmatrix} 0 \\ 0 \\ 0 \\ 1 \end{bmatrix} u_2$$

where input  $u_2$  is the steering velocity  $\omega$  (provided by the front wheel)

- The expression of  $u_1$  depends on the drive (front or back) of the vehicle
  - If the bicycle has front drive, we have directly  $u_1 = v$ , where  $v$  is the driving velocity of the front wheel

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## Kinematic model of a bicycle

- If the vehicle is back drive, we can derive  $u_1$  observing that the first two equations must coincide with those of the unicycle. This leads to set

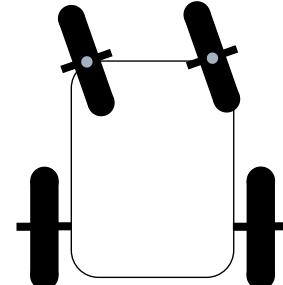
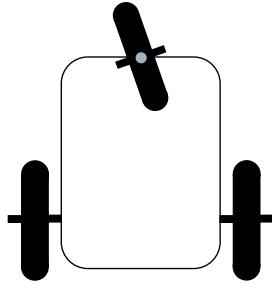
$$u_1 = \frac{v}{\cos \phi}$$

where  $v$  is the **drive velocity of the back wheel**, thus yielding the kinematic model

$$\begin{bmatrix} \dot{x} \\ \dot{y} \\ \dot{\theta} \\ \dot{\phi} \end{bmatrix} = \begin{bmatrix} \cos \theta \\ \sin \theta \\ \tan \phi \\ \frac{L}{v} \end{bmatrix} v + \begin{bmatrix} 0 \\ 0 \\ 0 \\ 1 \end{bmatrix} \omega$$

## Equivalence of the bicycle with other structures

- Also the bicycle presents balance problems in practice, but also in this case we have **kinematically equivalent structures**
  - tricycle**
  - automobile**



In both cases we may have rear or front drive. The point  $(x, y)$  is the midpoint of the back wheel axis,  $\theta$  is the vehicle heading, and  $\phi$  is the steering angle