

## Introduction

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Lecture 01

Robotic Exploration and Data Collection Planning



## Overview of the Lecture

- Part 1 – Course Organization
  - Course Goals
  - Means of Achieving the Course Goals
  - Evaluation and Exam
- Part 2 – Introduction to Robotics
  - Robots and Robotics
  - Challenges in Robotics
  - What is a Robot?
  - Locomotion



## Part I

### Part 1 – Course Organization



## Course

- **Robotic Exploration and Data Collection Planning (REDCP)**  
<https://cw.fel.cvut.cz/wiki/courses/crl-courses/redcp/start>
- Selected topics from **B4M36UIR – Artificial Intelligence in Robotics**  
<https://cw.fel.cvut.cz/wiki/courses/uir>



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- Center for Robotics and Autonomous Systems (CRAS)  
<http://robotics.fel.cvut.cz>
- **Computational Robotics Laboratory (CRL)**  
<http://comrob.fel.cvut.cz>



## Course Goals

- **Become** familiar with robotics problems and notion of robotic information gathering.
  - Existing problems and solutions.
- **Acquire experience** on combining approaches in robotic exploration program.
- **Acquire** knowledge of robotic data collection planning.

Tasks



## Course Organization and Evaluation

- Selected topics on robotic exploration and data collection planning in 6 lectures.  
With 2-3 more lectures as an option.
- **Task 1 (t1-exploration)** - Implementation of frontier-based exploration that combine six tasks.
  - t1a-ctrl – Open-loop robot motion control
  - t1b-react – Reactive obstacle avoidance
  - t1c-plan – Grid based path planning
  - t1d-map – Map building
  - t1e-frontiers – Determining frontiers as possible goal locations for exploration
  - t1f-exploration – Mobile robot exploration
  - Implement exploration pipeline with CoppeliaSim (and Python).
- **Task 2 (t2-tspn)** - Implementation of the solver to the data collection planning.
  - t2-tspn – Close Enough Traveling Salesman Problem.  
Data collection planning
- Implement unsupervised learning-based solver (in Python).
- Task(s) evaluation in January 2023.



## Resources and Literature

- Introduction to AI Robotics, *Robin R. Murphy*  
MIT Press, 2000  
Background and context
- The Robotics Primer, *Maja J. Mataric*  
MIT Press, 2007  
Background and context
- Planning Algorithms, *Steven M. LaValle*  
Cambridge University Press, 2006  
<http://planning.cs.uiuc.edu>
- Modern Robotics: Mechanics, Planning, and Control,  
*Kevin M. Lynch, Frank C. Park*  
Cambridge University Press, 2017



## Further Books 1/2

- Principles of Robot Motion: Theory, Algorithms, and Implementations,  
*H. Choset, K. M. Lynch, S. Hutchinson, G. Kantor, W. Burgard, L. E. Kavraki and S. Thrun*  
MIT Press, Boston, 2005
- Introduction to Autonomous Mobile Robots, 2nd Edition,  
*Roland Siegwart, Illah R. Nourbakhsh, and Davide Scaramuzza*  
MIT Press, 2011
- Computational Principles of Mobile Robotics,  
*Gregory Dudek and Michael Jenkin*  
Cambridge University Press, 2010



## Further Books 2/2

- Robot Motion Planning and Control, *Jean-Paul Laumond*  
Lectures Notes in Control and Information Sciences, 2009  
<http://homepages.laas.fr/jpl/book.html>
- Probabilistic Robotics,  
*Sebastian Thrun, Wolfram Burgard, Dieter Fox*  
MIT Press, 2005  
<http://www.probablistic-robotics.org/>
- Robotics, Vision and Control: Fundamental Algorithms in MATLAB,  
*Peter Corke*  
Springer, 2011  
<http://www.petercorke.com/RVC1/>



## Communicating Any Issue Related to the Course

- Use e-mail for communication
  - Put REDCP to the subject of your message



## Development Tools

- Python
  - Eventually C/C++ (gcc or clang).
  - http://www.coppeliarobotics.com/
- CoppeliaSim – robotic simulator.
- Sources and libraries provided by **Computational Robotics Laboratory**.
- Any other open source libraries.
- Information resources (IEEE Xplore, ACM, Science Direct, Springer Link)
  - IEEE Robotics and Automation Letters (RA-L), IEEE Transactions on Robotics (T-RO), International Journal of Robotics Research (IJRR), Journal of Field Robotics (JFR), Field Robotics (FR), Robotics and Autonomous Robots (RAS), Autonomous Robots (AuRo), etc.
  - IEEE/RSJ International Conference on Intelligent Robots and Systems (IROS), Robotics: Science and Systems (RSS), IEEE International Conference on Robotics and Automation (ICRA), European Conference on Mobile Robots (ECMR), etc.



## Overview of the Lectures

- Course information, Introduction to (AI) robotics.
- Robotic Paradigms and Control Architectures.
- Path planning.
- Robotic exploration.
- Multi-goal planning.
- Data collection planning.

- Curvature-Constrained Data Collection Planning. Optional
- Randomized Sampling-based Motion Planning Methods. Optional
- Overview of the research in Computational Robotics Laboratory. Optional



## Part II Part 2 – Introduction to Robotics



## What is Understood as Robot?



Rossum's Universal Robots (R.U.R.)



Industrial robots



Cyberdyne T-800



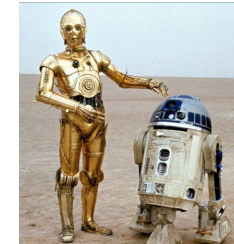
NS-5 (Sonny)

Artificial Intelligence (AI) is probably most typically understood as an intelligent robot.



## Intelligent Robots

- React to the environment – sensing.
- Adapt to the current conditions.
- Make decision and new goals. As in robotic exploration.



- Even though they are autonomous systems, the behaviour is relatively well defined.
- Adaptation and ability to solve complex problems are implemented as algorithms and techniques of **Artificial Intelligence**.

In addition to mechanical and electrical design, robot control, sensing, etc.



## Stationary vs Mobile Robots

- Robots can be categorized into two main groups.



Stationary (industrial) robots

Mobile robots

- Stationary robots – defined (limited) working space, but efficient motion is needed.
  - Motion planning tasks is a challenging problem.
- Mobile robot – it can move, and therefore, it is necessary to address the problem of navigation, which a combination of localization, mapping, and planning.



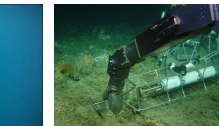
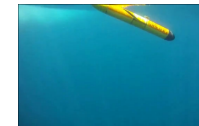
## Stationary Robots

- Conventional robots needs separated and human inaccessible working space because of safety reasons.
- Collaborative robots share the working space with humans.



## Types of Mobile Robots

- According to environment: ground, underground, aerial, surface, and underwater.
- Based on the locomotion: wheeled, tracked, legged, modular.



Robots and Robotics Challenges in Robotics What is a Robot? Locomotion

## Challenges in Robotics

- Autonomous vehicles – cars, delivery, etc.
- Consumable robots – toys, vacuum cleaner, lawn mower, pool cleaner
- Robotic companions
- Search and rescue missions
- Extraterrestrial exploration
- Robotic surgery
- Multi-robot coordination

In addition to other technological challenges, new efficient AI algorithms have to be developed to address the nowadays and future challenges.

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## Robotic Surgery

- Evolution of Laparoscopic Surgery
  - Complex operations with shorter postoperative recovery
- Precise robotic manipulators and teleoperated surgical robotic systems
- Further step is automation of surgical procedures.
  - One of the main challenges is planning and navigation in tissue.

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## Artificial Intelligence and Robotics

Artificial Intelligence (AI) field originates in 1956 with the summary that a intelligent machine needs:

- Internal models of the world;
- Search through possible solutions;
- Planning and reasoning to solve problems;
- Symbolic representation of information;
- Hierarchical system organization;
- Sequential program execution.

M. Mataric, Robotic Primer

- AI-inspired robot – **Shakey**
  - Artificial Intelligence laboratory of Stanford Research Institute (1966–1972)
  - Shakey – perception, geometrical map building, planning, and acting – early AI-inspired robot with **purely deliberative control**. See, e.g., <https://www.youtube.com/watch?v=gXd0yysp1I>

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## Robotics in REDCP

- Fundamental problems related to motion planning and mission planning with mobile robots.
- The discussed motion planning methods are general and applicable also into other domains and different robotic platforms including stationary robotic arms.
- Robotics is interdisciplinary field
  - Electrical, mechanical, control, and computer engineering;
  - Computer science fields such as machine learning, artificial intelligence, computational intelligence, machine perception, etc.
  - Human-Robot interaction and cognitive robotics are also related to psychology, brain-robot interfaces to neuroscience, robotic surgery to medicine, etc.

In REDCP, we will touch a small portion of the whole field, mostly related to motion planning and mission planning that can be “encapsulated” as robotic information gathering.

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## What is a Robot?

A robot is an autonomous system which exists in the physical world, can sense its environment, and can act on it to achieve some goals.

- The robot has a physical body in the physical world – **embodiment**.
- The robot has **sensors** and it can **sense/perceive** its environment.
- A robot has effectors and actuators – it can **act** in the environment.
- A robot has **controller** which enables it to be **autonomous**.

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## Embodiment

- The robot body allows the robot to act in the physical world.
  - E.g., to go, to move objects, etc.
- Software agent is not a robot.
- Embodied robot is under the same physical laws as other objects.
  - Cannot change shape or size arbitrarily.
  - It must use actuators to move.
  - It needs energy.
  - It takes some time to speed up and slow down.
- Embodied robot has to be aware of other bodies in the world.
  - Be aware of possible collisions.
- The robot body influences how the robot can move.
  - Notice, faster robots look smarter.

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## Sensing / Perception

- Sensors are devices that enable a robot to perceive its physical environment to get information about itself and its surroundings.
- Exteroceptive sensors and proprioceptive sensors.
- Sensing allows the robot to know its **state**.
- State can be **observable**, **partially observable**, or **unobservable**.
  - State can be **discrete** (e.g., on/off, up/down, colors) or **continuous** (velocity).
  - State space** consists of all possible states in which the system can be.
    - Space** refers to all possible values.
  - External state** – the state of the world as the robot can sense it.
  - Internal state** – the state of the robot as the robot can perceive it.
    - E.g., remaining battery.

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## Sensors

- Proprioceptive sensors** – measure internal state, e.g., encoders, inclinometer, inertial navigation systems (INS), compass, but also Global Navigation Satellite System (GNSS), e.g., GPS, GLONASS, Galileo, BeiDou.
- Exteroceptive (proximity) sensors** – measure objects relative to the robot.
  - Contact sensors** – e.g., mechanical switches, physical contact sensors that measure the interaction forces and torques, tactile sensors etc.
  - Range sensors** – measure the distance to objects, e.g., sonars, lasers, IR, RF, time-of-flight.
  - Vision sensors** – complex sensing process that involves extraction, characterization, and information interpretation from images.

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## Action

- Effectors** enable a robot to take an action.
  - They use underlying mechanisms such as muscles and motors called **actuators**.
- Effectors and actuators provide two main types of activities.
  - Locomotion** – moving around;
    - Mobile robotics – robots that move around.
  - Manipulation** – handling objects.
    - Robotic arms
- Locomotion mechanisms – wheels, legs, modular robots, but also propellers etc.

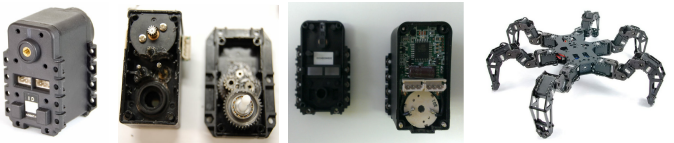
With more and more complex robots, a separation between mobile and manipulator robots is less strict and robots combine mobility and manipulation.

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## Effectors and Actuators

- **Effector** – any device on a robot that has an effect on the environment.
- **Actuator** – a mechanism that allows the effector to execute an action or movement, e.g., motors, pneumatics, chemically reactive materials, etc.
- **Electric motors** – Direct-Current (DC) motors, gears.
  - **Servo motors** – can turn their shaft to a specific position.  
DC motor + gear reduction + position sensor + electronic circuit to control the motor.



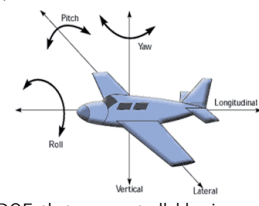
Hexapod with 3 servo motors (joints) per each leg has 18 servo motors in the total.

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## Degrees of Freedom (DOF)

- **Degree of Freedom (DOF)** is the minimal required number of independent parameters to completely specify the motion of a mechanical system. *It defines how the robot can move.*  
In 3D space, a body has usually 6 DOF (by convention).
  - **Translational DOF** –  $x, y, z$ .
  - **Rotational DOF** – roll, pitch, and yaw.



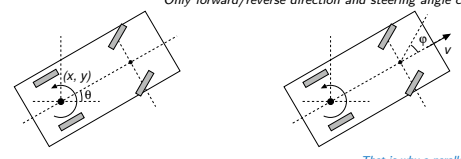
- **Controllable DOF (CDOF)** – the number of the DOF that are controllable, i.e., a robot has an actuator for such DOF.

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## DOF vs CDOF

- If a vehicle moves on a surface, e.g., a car, it actually moves in 2D.
- The body is at the position  $(x, y) \in \mathbb{R}^2$  with an orientation  $\theta \in \mathbb{S}^1$ .
- A car in a plane has DOF = 3,  $(x, y, \theta)$  but CDOF=2,  $(v, \varphi)$ .  
*Only forward/reverse direction and steering angle can be controlled.*



*That is why a parallel parking is difficult.*


- A car cannot move in an arbitrary direction, but 2 CDOF can get car to any position and orientation in 2D.
- To get to a position, the car follows a **continuous trajectory (path)**, but with **discontinuous velocity**.  
*Uncontrollable DOF makes the movement more complicated.*

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## Ratio of CDOF to the Total DOF

- The ratio of Controllable DOF (CDOF) to the Total DOF (TDOF) represents how easy is to control the robot movement.
- **Holonomic** (CDOF=TDOF, the ratio is 1) – holonomic robot can control all of its DOF.
- **Nonholonomic** (CDOF<TDOF, the ratio < 1) – a nonholonomic robot has more DOF that it can control. *E.g., a car.*
- **Redundant** (CDOF>TDOF, the ratio > 1) – a redundant robot has more ways of control.



17 CDOF 6 DOF Hexapod 24 TDOF, 18 CDOF Hexapod walking robot

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## Locomotion

*From the Latin Locus (place) and motion.*

- **Locomotion** refers how the robot body moves from one location to another location.
- The most typical effectors and actuators for ground robots are **wheels** and **legs**.
- Most of the robots need to be **stable** to work properly.
  - **Static stability** – a robot can stand, it can be static and stable.  
*Biped robots are not statically stable, more legs make it easier. Most of the wheeled robots are stable.*
  - **Statically stable walking** – the robot is stable all the times.  
*E.g., hexapod with tripod gait.*
  - **Dynamic stability** – the body must actively balance or move to remain stable, the robots are called dynamically stable.  
*E.g., inverse pendulum.*

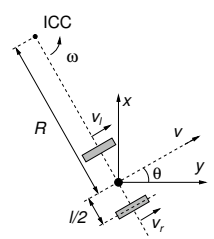
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## Locomotion – Wheel Robots

- One of the most simple wheeled robots is **differential drive** robot.
  - It has two driven wheels on a common axis.
  - It may use a castor wheel (or ball) for stability.
  - It is nonholonomic robot.

*Omnidirectional robot is holonomic robot.*



- $v_l$  and  $v_r$  are velocities along the ground of the left and right wheels, respectively.
- $\omega = \frac{v_r - v_l}{l}$ ,  $R = \frac{l}{2} \frac{v_l + v_r}{v_r - v_l}$
- For  $v_l = v_r$ , the robot moves straight ahead. *R is infinite.*
- For  $v_l = -v_r$ , the robot rotates in a place. *R is zero.*
- Simple motion control can be realized in a turn-move like schema.

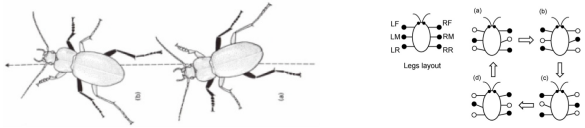
Further motion control using path following or trajectory following approaches with feedback controller based on the position of the robot to the path / trajectory.

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## Locomotion – Legged Robots (Gaits)

- **Gait** is a way how a legged robot moves.
- A gait defines the order how the individual legs lift and lower and also define how the foot tips are placed on the ground.
- Properties of gaits are: stability, speed, energy efficiency, robustness (how the gait can recover from some failures), simplicity (how complex is to generate the gait).
- A typical gait for hexapod walking robot is **tripod** which is stable as at least three legs are on the ground all the times.




Gullan et al., The Insects: An outline of entomology, 2005 lida et al. 2008

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## Locomotion of Hexapod Walking Robot

- Six identical leg each consisting of three parts called **Coxa**, **Femur**, and **Tibia** (3 DoF).



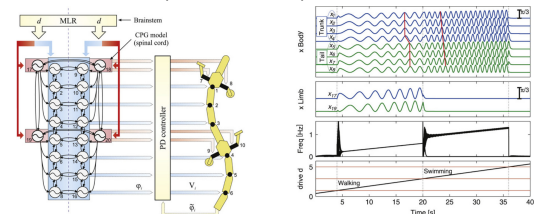
- The movement is a coordination of the **stance** and **swing** phases of the legs defined by the gait, e.g., tripod.
- A **stride** is a combination of the leg movement with the foot tip on the ground (during the **stance phase**) and the leg movement in a particular direction (in the **swing phase**) within one **gait cycle**.
- $T_{Stance}$ ,  $T_{Swing}$ , and  $T_{Stride} = T_{Stance} + T_{Swing}$  defines the **duty factor**  $\beta = T_{Stance} / T_{Stride}$ .  
Tripod  $\beta = 0.5$
- Various gaits can be created by different sequences of stance and swing phases.

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## Central Pattern Generator (CPG)

- **Central Pattern Generators (CPGs)** – are neural circuits to produce rhythmic patterns for various activities, i.e., locomotor rhythms to control a periodic movement of particular body parts.
- Salamander CPG with 20 amplitude-controlled phase oscillators.



Auke Jan Ijspeert, Neural Networks, 2008

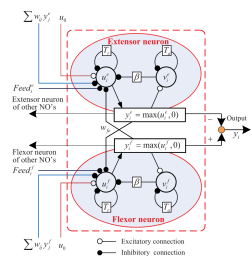
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### Example of Rhythmic Pattern Oscillator

- Matsuoka oscillator model based on biological concepts of the extensor and flexor muscles.
- Van der Pol oscillator

$$\frac{d^2x}{dt^2} - \mu(1 - x^2)\frac{dx}{dt} + x = 0.$$

- The rhythmic patterns define the trajectory of the leg end point (foot tip).
- Joint angles can be computed from the foot tip coordinates using the **Inverse Kinematics**.



Matsuoka, K. (1985). Sustained oscillations generated by mutually inhibiting neurons with adaptation. *Biological Cybernetics* 52, 367-376

An example of simple CPG to control hexapod walking robot will be shown during the labs.

### Topics Discussed

- Information about the Course
- Overview of robots, robotics, and challenges
  - Robot – Embodied software agent
  - Sensor, Controller, Actuators
  - Degrees of Freedom (DOF) and Controllable DOF
  - Mobile Robot Locomotion
  - Locomotion Gaits for Legged Robots
  - Central Pattern Generator
- Next: **Robotic Paradigms and Control Architectures**

### Control Architectures

- A single control rule may provide simple robot behaviour.
  - Notice, controller can be feed-forward (open-loop) or feedback controller with vision based sensing.
- Robots should do more than just avoiding obstacles.
- The question is “How to combine multiple controllers together?”
- **Control architecture** is a set of guiding principles and constraints for organizing the robot control system.
  - Guidelines to develop the robotic system to behave as desired.
    - It is not necessary to know control architectures for simple robotic demos and tasks. But it is highly desirable to be aware of architectures for complex robots.

### Summary of the Lecture