Hochschule Bonn-Rhein-Sieg University of Applied Sciences





# Simulation-Based Robot Software Development

Dr. Alex Mitrevski Master of Autonomous Systems

#### Structure

- Motivation for using simulations
- Physics engines
- Unified Robot Description Format (URDF)









# **Motivation for Using Simulations**

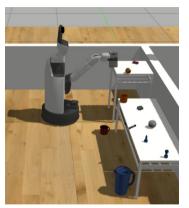








#### What is a Robot Simulator?



Our HSR robot performing a simulated clean up task

► A simulator in general is a virtual environment in which dynamic physical processes can be modelled

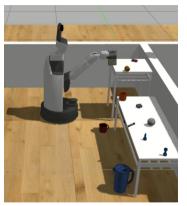








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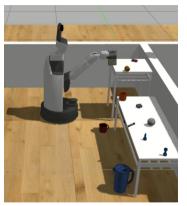








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- ► A simulator in general is a virtual environment in which dynamic physical processes can be modelled
- A robot simulator is one that simulates robotic systems and robot interaction scenarios
- Simulators are always associated with a programming API that makes it possible to create custom simulated worlds









#### Simulator Uses in Robotics

▶ There are two main uses of simulators in robotics:

- ▶ To create simulation-based testbeds for verifying the operation of robot prototypes
- ► To collect data for machine learning







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  - ► To create simulation-based testbeds for verifying the operation of robot prototypes
  - ► To collect data for machine learning
- Simulators are also sometimes used for robotics competitions so that different algorithmic approaches for solving a given problem can be compared under standardised conditions









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The feasibility of developed robot algorithms can be tested **before conducting a real-robot test** 









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Simulations enable performing algorithmic tests without the danger of damaging a robot









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Tests in simulations can be set up so that a robot is tested in a larger variety of scenarios than would be possible with physical testing

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#### Continuous testing

Simulations can be **integrated into continuous integration workflows** so that program changes are automatically verified









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Due to the simplicity of making changes to simulated worlds, datasets exposing a robot to a variety of scenarios can be collected









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#### Diverse data collection

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#### Safe learning

Simulations enable a robot to try out potentially dangerous actions, which are inevitable for some learning algorithms









### Many Uses of Simulations in Robotics

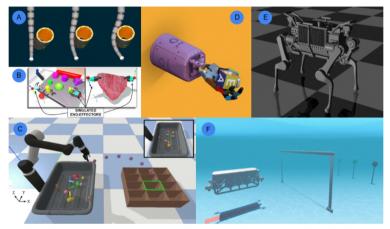


FIGURE 1. Diversity of simulation scenes and environments throughout robotics (a) soft robotics in Simulation Open Framework Architecture [3], (b) medical robotics in Asynchronous Multi-Body Framework [4], (c) manipulation in PyBullet [5], (d) dexterous manipulation in MuloCo [6], (e) legged locomotion in RaiSim [7] and (f) underwater vehicles in URSim [8].

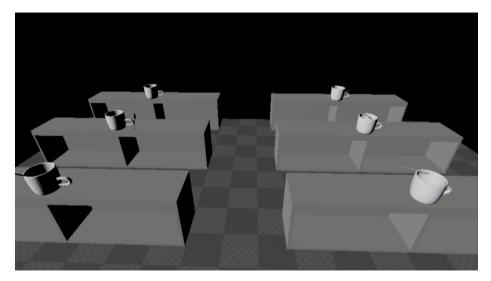
J. Collins et al., "A Review of Physics Simulators for Robotic Applications," in IEEE Access, vol. 9, pp. 51416-51431, 2021.







#### Simulations are Good for Parallel Scenario Execution



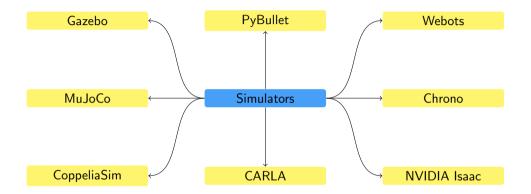








#### **Common Robot Simulators**











# Robot Simulators and Game Engines



Environment in the CARLA simulator (based on Unreal Engine): https://carla.readthedocs.io/en/latest/map\_town03/



Environment in Gazebo









- Robot simulators are typically developed independently of game engines and are specifically tailored to fit the needs of robotics developers
  - For instance, Gazebo has many robot models as well as plugins for a variety of commonly used robot sensors
  - Most robotics simulators also support standard robotics development frameworks, such as ROS

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- ► For instance. Gazebo has many robot models as well as plugins for a variety of commonly used robot sensors
- Most robotics simulators also support standard robotics development frameworks, such as ROS
- ► Some robot simulators are, however, based on game engines, such as Unity or Unreal Engine
  - ► Game engines can usually render more photorealistic worlds, which is particularly important if a robot needs to collect visual data in simulation



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# **Physics Engines**

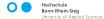








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  - > Engines primarily differ in the solvers they implement and the way they set up the problem
- Most simulators support multiple physics engines
  - The engine can be exchanged so that higher accuracy or higher efficiency is achieved, depending on the use case

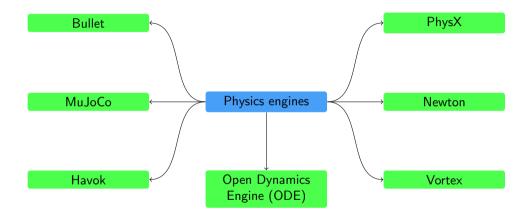








### A Multitude of Physics Engines

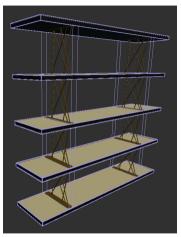












The collision model of the complex side grid is a simple box around it



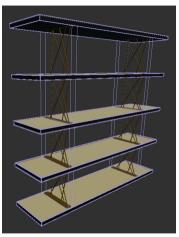
This power plug has a detailed collision model

#### Simulators represent objects by polygon meshes









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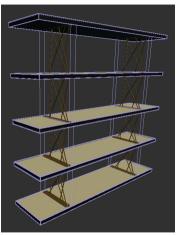
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- ▶ Objects are actually represented by two different models:









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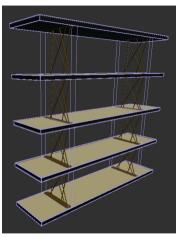
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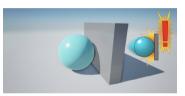
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- Simulators represent objects by polygon meshes
- Objects are actually represented by two different models:
  - Visual model: A model of the object that is rendered by a simulator, including all object segments, materials, and element colours
  - Collision model: A model used for identifying body collisions and computing collision impacts; this is typically simpler than the visual model so that efficient collision detection procedures can be used









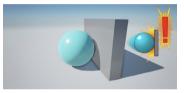
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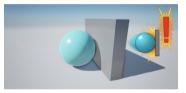
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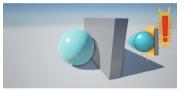
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  - Collision detection: This is a continuously running process that checks whether there is an interaction between any parts of a body
  - Collision effect handling: When two bodies collide, the impact on the bodies needs to be determined and applied











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- If collisions are not handled or the handling is too slow compared to the motion of the bodies of interest, the bodies will overlap









# Soft-Body Dynamics

The dynamic behaviour of deformable objects under external forces is referred to as soft-body dynamics; this is in contrast to rigid-body dynamics, which, as the name says, is concerned with the dynamic behaviour of rigid bodies









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- Soft-body dynamics can be modelled in different ways, for instance using a spring-mass system between different points on a body
- All physics engines are able to simulate rigid-body dynamics; soft-body dynamics is, on the other hand, less commonly supported
  - Soft-body dynamics solvers are more computationally demanding than rigid-body solvers, so some physics engines do not implement them at all and opt for simpler models







# Unified Robot Description Format (URDF)









#### What is URDF?

- The Unified Robot Description Format (URDF) is an XML-based language for describing robots and simulated worlds
- ▶ URDF robot models can be found for most commonly used robots
  - ▶ URDF models are typically developed and provided by the robot manufacturers themselves
- Some simulators have their own description formats, but most either support URDF directly or provide tools to convert URDF to their custom formats









#### **URDF Elements**

- In URDF, complex bodies, such as that of a robot, are defined through composing elements and connections between them, namely through links and joints:
  - Links are used to define body components
  - ▶ Joints define connections between links









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- URDF imposes a tree structure on bodies:
  - ► The structure has a single root
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```
Based on the YouBot's URDF:
https://github.com/a2s-institute/youbot_description
```

```
<?xml version="1.0"?>
<robot name="voubot">
    k name="base footprint"/>
    <link name="base link">
      <visual>
        <origin xyz="0 0 0" rpy="0 0 0"/>
        <geometry>
          <mesh filename="package://youbot description/
                 meshes/youbot base/base.dae"/>
        </geometry>
        <material name="vouBot/DarkGrev"/>
      </visual>
      <inertial>
        <mass value="22.0"/>
        <origin xvz="0 0 0"/>
        <inertia ixx="5.7" ixy="-0.01" ixz="1.3" iyy="5.7"
                iv_{z=}"-0.007" iz_{z=}"3.7"/>
      </inertial>
      <collision>
        <origin xvz="0 0 0" rpv="0 0 0"/>
        <geometrv>
          <box size="0.57 0.36 0.1" />
        </geometry>
      </colligion>
    </link>
    <joint name="base footprint joint" type="fixed">
      <origin xyz="0 0 0" rpy="0 0 0"/>
      <child link="base link"/>
      <parent link="base footprint"/>
    </ioint>
</robot>
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 $Based \ on \ the \ YouBot's \ URDF: \\ https://github.com/a2s-institute/youbot_description$ 

```
<link name="wheel link fl">
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    <mass value="1.4"/>
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   <inertia ixx="0.01" ixy="-0.0007" ixz="0.0005" iyy="
          0.02" ivz="-0.000004" izz="0.01"/>
  </inertial>
  <vieual>
    <origin xyz="0 0 0" rpy="0 0 0"/>
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     <sphere radius="0.0475"/>
   </geometry>
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  </wienal>
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- Physical properties, such as the link's mass and inertia, can be specified as well









#### Joints

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```
<joint name="wheel_joint_fl" type="continuous">
    <origin xyz="0 0 0" ryp="0 0 0"/>
    <aus xyz="0 1 0"/>
    <parent link="caster_link_fl"/>
    <child link="wheel_link_fl"/>
    <dynamics damping="l.0" friction="l.0"/>
</joint>
```

```
//////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////////
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    <child link="base_link"/>
    <parent link="base_footprint"/>
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<joint name="wheel_joint_fl" type="continuous">
    <origin xyz="0 0 0" ryp="0 0 0"/>
    <axis xyz="0 1 0"/>
    <parent link="caster_link_fl"/>
    <child link="wheel_link_fl"/>
    link ffort="30" velocity="10"/>
    <safety_controller k_velocity="10.0"/>
    </iont>
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- ▶ URDF supports multiple types of joints:
  - Fixed: Joints that cannot move
  - Continuous: Rotate freely around a given axis without any limits
  - Revolute: Rotate around a given axis, but within specified limits
  - Prismatic: Translate along a given axis
  - Planar: Translate along two axes
  - **Floating**: Able to move freely in 3D







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- For some joint types, additional parameters can also be specified, such as dynamics parameters or controller coefficients







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Adapted from Freddy's URDF: https://github.com/a2s-institute/freddy\_description

```
<?xml version="1.0"?>
<robot xmlns:xacro="http://www.ros.org/wiki/xacro">
    <xacro:property_name="wheel_radius"_value="0.05" />
    <xacro:property name="wheel mass" value="1.0" />
    <xacro:property name="inertia wheels" value="0.001" />
    <xacro:include filename="$(find freddy base description)/urdf</pre>
           /common.xacro" />
    <xacro:macro name="kelo wheel" params="name parent *origin</pre>
           material name">
        <joint name="${name} joint" type="fixed">
            <xacro:insert block name="origin" />
            <parent link="${parent}"/>
            <child link="${name} link"/>
        </ioint>
        k name="${name} link">
            <visual>
                <geometry>
                     <sphere radius="${wheel radius}" />
                </geometry>
                <material name="${material name}"/>
            \langle /visual \rangle
            <colligion>
                 <geometry>
                     <sphere radius="${wheel radius}" />
                </geometry>
            </colligion>
            <xacro:sphere inertia mass="${wheel mass}" radius="${</pre>
                   wheel radius}" />
        </link>
    </vacro:macro>
</robot>
```



- Robot development is often supported by the use of simulators, which can be used both for algorithmic testing as well as in the context of machine learning
- All simulators use physics engines, which model physical phenomena and provide solvers for approximating those
- URDF and its improvement xacro are commonly used for describing robots and specifying various parameters associated with robot models







