# Control of Locomotion in Modular Robotics Master Project

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Image: A matrix

B + 4 B +





### Motivation

- Challenges of Locomotion in Modular Robotics
- Preliminary Work

## 2 Our Contribution/Results

- Implementation of the Experimental Setup
- Experiments





Challenges of Locomotion in Modular Robotics Preliminary Work

# Outline



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# Modular Robotics Characteristics

A modular robot is constructed out of multiple homogeneous building blocks with:

- at least one actuated degree of freedom
- a (dynamic) connection mechanism
- computational power
- optional sensing abilities
- communication abilities
- electrical power



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# Modular Robotics Promises and Applications

Compared to "classical" robots:

- robustness
- adaptiveness
- self-repair
- economy





Image: A matrix

A B + A B +

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# Modular Robotics Promises and Applications

### Compared to "classical" robots:

- robustness
- adaptiveness
- self-repair
- economy

### Space Missions







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# Modular Robotics Promises and Applications

### Compared to "classical" robots:

- robustness
- adaptiveness
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- economy

### Urban Search and Rescue







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# Modular Robotics Promises and Applications

### Compared to "classical" robots:

- robustness
- adaptiveness
- self-repair
- economy

### Adaptive Furniture





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# Modular Robotics Locomotion

- Locomotion is one of the key requirements
- Coordination of multiple actuated joints
- Bio-inspired Central Pattern Generator (CPG) approach is appealing
- A CPG is a network of neurons able to generate coordinated rhythmic activity





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**Our Contribution/Results** Summary **Challenges of Locomotion in Modular Robotics Preliminary Work** 

# YaMoR Robot

Module







Our Contribution/Results Summary Challenges of Locomotion in Modular Robotics Preliminary Work

# YaMoR Robot

## Module







Our Contribution/Results Summary

# YaMoR Robot

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### Module



### Components







Our Contribution/Results Summary

# YaMoR Robot

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### Module



### Robot Example



(a)





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# **CPG** Design

$$\dot{\phi}_i = \omega_i + \sum_j (\omega_{ij} r_j sin(\phi_j - \phi_i - \varphi_{ij}))$$
$$\ddot{r}_i = a_r (\frac{a_r}{4} (R_i - r_i) - \dot{r}_i)$$
$$\ddot{x}_i = a_x (\frac{a_x}{4} (X_i - x_i) - \dot{x}_i)$$
$$\theta_i = x_i + r_i cos(\phi_i)$$





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# **CPG** Design

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$$\theta_{i} = x_{i} + r_{i} \cos(\phi_{i})$$



# Learning Algorithm - Powell's Method

- Simple heuristic that has shown interesting results in simulation
- Repeated one-dimensional minimizations along a constantly updated direction set
- One-dimensional minimization with Brent's method
- Powell's method changes the direction set depending on the function



### Parabolic Interpolation



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# Learning Algorithm - Powell's Method

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- One-dimensional minimization with Brent's method
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# Learning Algorithm - Particle Swarm Optimization

- Stochastic optimization method inspired by the movement of flocking birds
- A set of particles spreaded in a virtual space fly towards the optimum of the function
- New position of a particle depends on its best performance and the best performance of its neighborhood







# YaMoR Communication Protocol

- Original software delivered with the Bluetooth chip lacks the features needed to implement the CPG model
- Scatternet protocol built on top of it allows easy intermodule communication
- After initial network configuration, packets are simply launched in the network
- Transparent communication







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Implementation of the Experimental Setup Experiments

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Implementation of the Experimental Setup Experiments

# Experimental Setup Overview



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# LED Tracking

- Application running on a dedicated PC
- Provides the position of the LED to a remote PC each 39 ms on average
- Highest quantity of white pixels in a moving window
- Correction function applied on the remote PC

# Original Image

### Corrected Image



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# **Optimization Algorithms**

- Implemented on a remote PC
- Function to minimize is given as:

$$f(\vec{x}) = \frac{1}{avg\_speed + 1}$$

- $\vec{x}$  contains values for the parameters under optimization
- avg\_speed is computed as the displacement of the LED during 8 seconds, over the time between the two measurements
- All the parameters are limited in the range [0, 1]





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# **Robot Control**

- Remote PC connected to a spare Bluetooth device via serial port
- Commands are sent to the modules, using the Scatternet protocol
- Scatternet protocol limitations:
  - Initial network structure



Broadcast and inter-message time





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# **CPG** Implementation

- An oscillator runs in each module
- Its output controls the position of the servo via a PWM
- An oscillator can be coupled with up to 3 neighbors
- A module periodically receives/sends state variables from/to the neighbors it is coupled



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# Simulation Environment

- All the experimental setup has been reproduced in Webots
- Nearly the same code is used
- Possibility to have simulated and real experiments in parallel
- Ideal substrate for testing new robots or doing systematic experiments







Image: A match and a match

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# Preliminary - Noise on Fitness Evaluation

- For the same set of parameters, different fitness evaluations
- Non linearity in the movement of the robot
- Irregularity of the ground



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# Preliminary - Fitness Example in 1 Dimension

- Several possible local optima for a single parameter when the others are fixed
- Wide exploration required to find the best one
- Even if a local optimum is found for a parameter, the others often adapt to generate a new efficient gait



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# **Snake Robot - Configuration**









Image: A image: A

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# Snake Robot - Powell's Method









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# Snake Robot - Particle Swarm Optimization









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# Snake Robot - Movie







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# **Tripod Robot - Configuration**







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# Tripod Robot - Powell's Method



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# **Tripod Robot - Particle Swarm Optimization**



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# Tripod Robot - Movie







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# **Quadruped Robot - Configuration**









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# Quadruped Robot - Powell's Method





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# Quadruped Robot - Particle Swarm Optimization









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# Quadruped Robot - Movie









- Building of a complete distributed system, with software running on different platforms
- Validation of the previous simulations with Powell's method
- Comparison with Particle Swarm Optimization

- Outlook
  - Long-life learning
  - Control of direction





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