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# **Humanoid robot learns walking by human demonstration**

## **Master Thesis**

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# Abstract

In this paper, a method designed for making the humanoid robot walking is developed by using the DQN in reinforcement learning. Machine learning has demonstrated a promising feature in many fields including robotics. However the supervised learning algorithms are more often applied. But supervised learning like neural networks always need a huge amount of data to train, which is sometimes not permitted in real situation. Although not much data is required in reinforcement learning, it need many attempts in its environment thus concluding a strategy. For a humanoid robot, it is not allowed to have too much bad attempts because a fall down may lead to the injury of a joint. In this paper an method that the robot learns walking with the help of human can avoid unnecessary falls is proposed.

**Keywords:** humanoid robot, reinforcement learning, robot walking

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# List of Abbreviations

**KDE** K Desktop Environment

**SQL** Structured Query Language

**Bash** Bourne-again shell

**JDK** Java Development Kit

**VM** Virtuelle Maschine

**IC** Inter-Integrated Circuit

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# **1 Introduction**

## **1.1 Robot**

## **1.2 NAO**

## **1.3 CPG**

## **2 State of art**

### **2.1**



## 3 Implementation

### 3.1 Implementation Swing on Nao by Q-learning

As it is mentioned in previous chapter, the Q-learning method could be used to realize many control problems. In this section, the Q-learning algorithm is used to control the 2 alpha values based on CPG algorithm

## 4 Referencing

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# Bibliography

- [1] Chen, T.: Audiovisual speech processing. IEEE Signal Processing Magazine 18(1), 9–21 (2001)
- [2] Glueck, H.I.: Autorenrichtlinien zur gi-edition lecture notes in informatics (lni) (2005), [http://www.gi-ev.de/fileadmin/redaktion/2005\\_LNI/LNI-Autorenrichtlinien.pdf](http://www.gi-ev.de/fileadmin/redaktion/2005_LNI/LNI-Autorenrichtlinien.pdf)
- [3] Pepper, P.: Grundlagen der Informatik. Oldenbourg (1992)
- [4] Tolksdorf, R.: Die lni dokumentenklasse fr latex (1212), <http://www.gi-ev.de/fileadmin/redaktion/Autorenrichtlinien/LNLaTeX-Vorlage.zip>