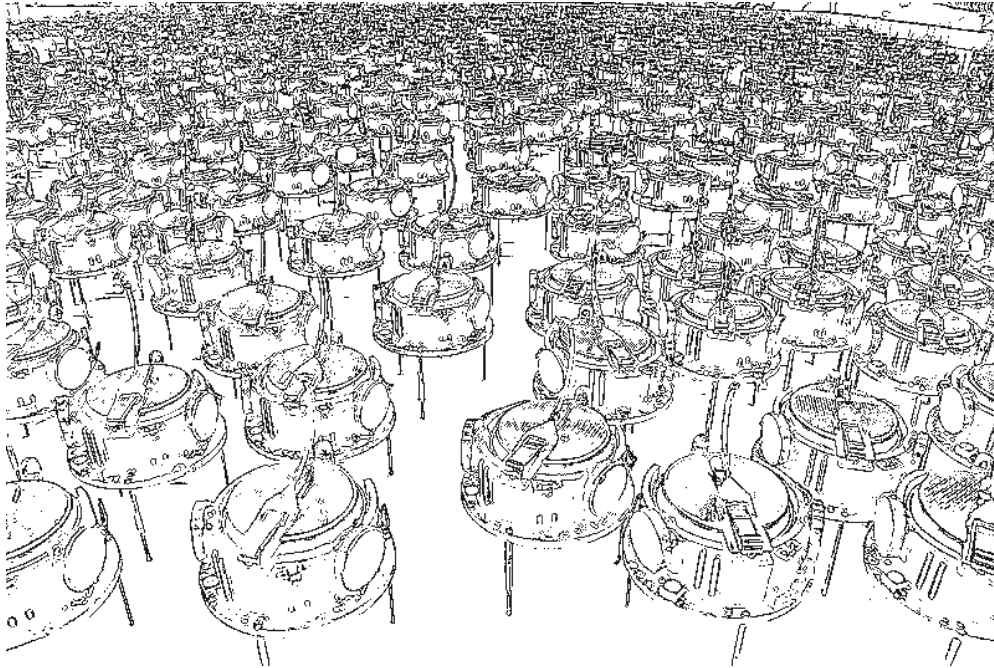


Intelligent Multi Agent Systems



Introduction

Gerhard Neumann

Today's Agenda



- ➡ Organization
- ➡ Introduction

Autonomous System Labs @ TUDa



Homepage: <http://www.ausy.informatik.tu-darmstadt.de/>

Computational Learning for Autonomous Systems (CLAS)

- ➔ Head: Gerhard Neumann (geri@robot-learning.de)
- ➔ Founded in Sept. 2014
- ➔ Focus on *Algorithms for Autonomous Learning Systems, Multi-Agent Systems*



Intelligent Autonomous Systems (IAS)

- ➔ Head: Jan Peters (mail@jan-peters.net)
- ➔ Founded in June 2011
- ➔ Focus on *Robotics and Machine Learning*

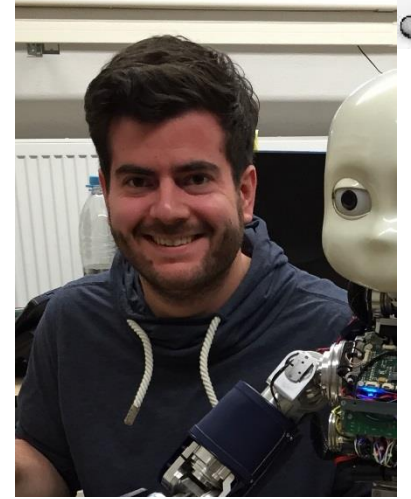


15 Team members, 4 international projects, many top publications and awards

Teaching Assistants...



[Gregor Gebhardt](#) started his PhD at the Fachgebiet Computational Learning for Autonomous Systems (CLAS) in the beginning of 2015. His research is focusing on non-parametric inference and kernel-based methods.



[Oleg Arenz](#) started his PhD at the Fachgebiet Computational Learning for Autonomous Systems (CLAS) in May 2015. His research is focusing on inverse reinforcement learning and learning from human instructions.



Organizational Issues: Website & Moodle



Website:

<http://www.ausy.tu-darmstadt.de/Teaching/IntelligentMultiAgentsSystemsLecture>

Slides: Password: Mult1Ag3ntsL3ctur3, **User:** imas

moodle PW: MrSm1th

Course Language



...will be (Austrian) **ENGLISH**

Why?

- ➡ Austrian is beautiful
- ➡ Essentially *all* machine learning literature is in English.
- ➡ Knowing the proper *terminology* is essential!
- ➡ It's a good training for you
- ➡ Questions and answers in emails/homework/exams may be given in **German** (However, this is not encouraged...).

Exam & Bonus Points from Homework



There will be a written exam ...

- ➡ Approximate date: The week after the end of classes...
- ➡ Homework will count as bonus points!
- ➡ 80% of Homework = + 1.0 grade

Homework Exercises:

- ➡ We only use them for bonus points!
- ➡ However, expect that details are asked in the exam.

Homework



There will be **four homework** assignments!

Each assignment will contain

- ➡ a few multiple choice questions,
- ➡ a few essay questions,
- ➡ and programming exercises (Matlab).

Course Overview



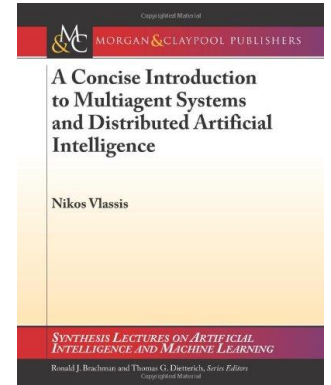
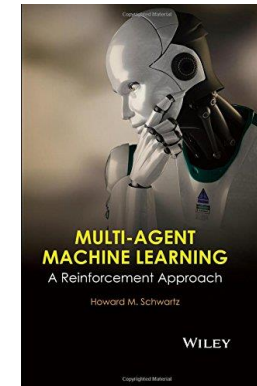
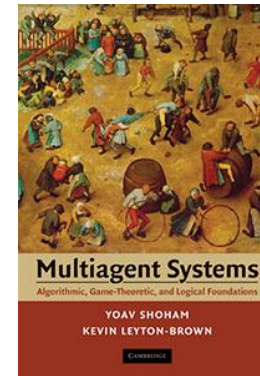
- ➡ Introduction, Characteristics, Agents, Utility Theory...
- ➡ Game Theory, Nash Equilibria and Other Solution Concepts
- ➡ Finding Solution Concepts
- ➡ Games in Extensive Form, Sequential Games
- ➡ Learning with a Single Agent
- ➡ Deep Reinforcement Learning
- ➡ Learning with Multiple Agents
- ➡ Learning for Games
- ➡ Partial Observable Markov Decision Processes (POMDP)
- ➡ Decentralized POMDPS
- ➡ Swarm Intelligence

Background reading



➡ More than half of the lecture will follow 3 books ...

- ➡ *Multi-Agent Systems: Algorithmic, Game-Theoretic, and Logical Foundations* (Y. Shoham, K. Leyton-Brown)
- ➡ *Multi-Agent Machine Learning: A Reinforcement Approach* (H. Schwartz)
- ➡ *A Concise Introduction to Multi-Agent Systems and Distributed AI* (N. Vlassis)



➡ Remaining content will be from papers & tutorials (see homepage)!

➡ Other classical background reading...

C. Bishop: Pattern Recognition and Machine Learning, Springer, 2006.

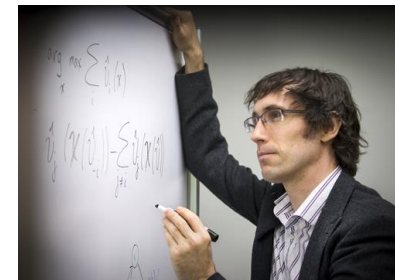
R. Sutton, S. Barto: Reinforcement Learning, MIT Press, 1998.

Background reading



Some slides are also borrowed from the VUB ARTIFICIAL INTELLIGENCE LAB in Brussels

- ➡ Tom Laenerts (Uni Brussels)
- ➡ Nikos Vlassis (now Adobe Research)
- ➡ Kevin Leyton-Brown (Stanford)



... so they should get the proper credit

How does it fit do your course plan?



Related Classes:

➡ More Agent-Based Learning:

- Lernende Roboter (WS)

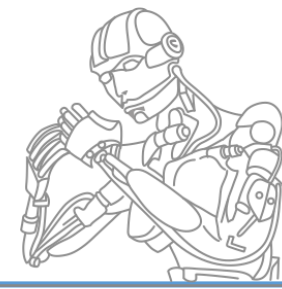
➡ More (un-)supervised learning:

- Maschinelles Lernen: Statistische Methoden (SoSe),
- Maschinelles Lernen: Statistische Methoden 2 (WS),
- Maschinelles Lernen: Symbolische Ansätze (WS).

➡ More on Distributed Systems:

- Distributed Reactive Software Systems (DReSS) (SoSe)

Your way to the thesis...



Theses:

- ➡ Our classes bring you right to **B.Sc. or M.Sc.** Thesis level (checkout our homepage)
- ➡ Currently 15 Thesis are supervised by the Autonomous Systems Labs
- ➡ Many Master and Bachelor Theses end up in a **Publication!**
- ➡ If you want to do your Ph.D. (=Dr) in Machine Learning for Autonomous Systems our classes and a thesis with us are an optimal preparation.

Your way to the thesis...



Among the most important questions ever:

continue the research road to a Ph.D. (=Dr.)?

An exciting life:

- follow *your* ideas & dreams...
- actively acquire knowledge and refine it...
- never stop challenging your brain
- enjoy international conferences and visits with collaborators around the world...

But also a lot of work...

- You need commitment ...
- ... and talent

It isn't for everybody:

➔ **Want to find out whether it's the right thing for you?**



Your way to the thesis...



Preparation for the thesis

Lernende Roboter

Intelligent Multi-Agent Systems



**Lernende Roboter:
Integriertes Projekt Teil 1**
Literature Review and
Simulation Studies

**Lernende Roboter:
Integriertes Projekt Teil 2**
Evaluation and Submission to a
Conference

Integriertes Projekt (1 and 2)



Mini-Class

- ➔ Perfect preparation for master thesis
- ➔ ... or prolong your Bachelor's thesis to get a publication
- ➔ The lecture serves as background!
- ➔ Work on interesting research ideas
- ➔ We give you a few suggestions on platforms and algorithms.

Your idea becomes your project! This can only be fun!

Your creativity is what will make it an amazing experience for both you & us!



Master and Bachelor Thesis

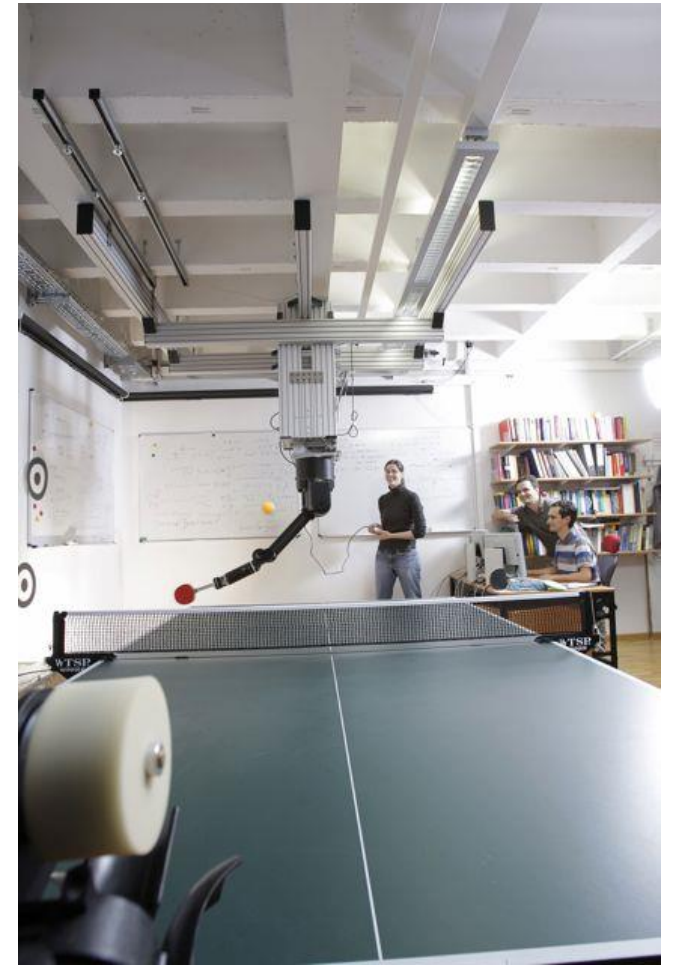


Topics from Multi-Agent Systems / Robot Learning / Machine Learning

Checkout our homepage!



Computational Learning for Autonomous Systems (CLAS)



Today's Agenda



➡ Organization

➡ Introduction

Introduction



Why?

Studying Multi-Agent Systems helps us understand situations in which decision-makers need to interact

Introduction



We do it everyday...



Games



Economics



Politics

Introduction



© Tom Lenaerts, 2010

Nature does it too...

What ?



Biology

Why Multi-Agent Systems?



- ➔ Some domains require it.
- ➔ Interoperation of legacy systems
- ➔ Parallelism
- ➔ Robustness
- ➔ Scalability
- ➔ Simpler programming.



“**Intelligence** is deeply and inevitably coupled with **interaction**.” –
Gerhard Weiss

Interesting applications



Computer Games:

- ➡ Human-like behavior
- ➡ Strategy Games
- ➡ Poker

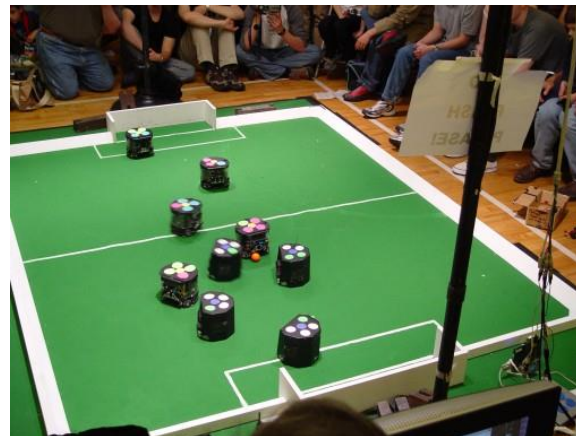
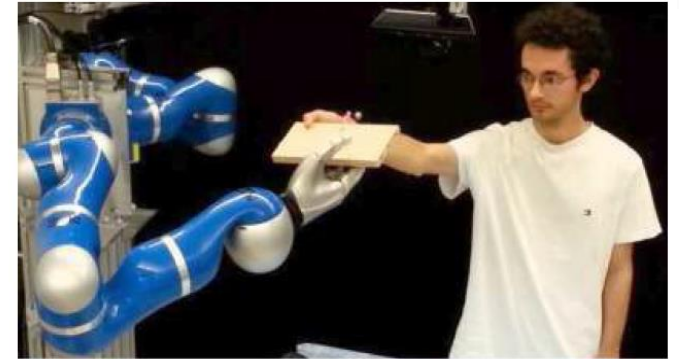


Interesting applications



Robotics:

- ➡ Human-Robot Interaction
- ➡ Planetary exploration
- ➡ Search and Rescue
- ➡ Robot Soccer



Interesting applications



Robot Soccer



Interesting applications



Human-Robot Interaction

Learning Multiple Collaborative Tasks with a Mixture of Interaction Primitives

**Marco Ewerton, Gerhard Neumann, Rudolf Lioutikov,
Heni Ben Amor, Jan Peters, Guilherme Maeda**

**IAS, TU-Darmstadt
2014**

Interesting applications



Unmanned Aerial Vehicles

The Flying Machine Arena

Cooperative Quadcopter Ball Throwing and Catching



ETH

Eidgenössische Technische Hochschule Zürich
Swiss Federal Institute of Technology Zurich

Towards a Swarm of Nano Quadrotors

Alex Kushleyev, Daniel Mellinger, and Vijay Kumar
GRASP Lab, University of Pennsylvania

Interesting applications



Swarm-Robotics (Robotics x 100):

- ➡ Massive Manipulation
- ➡ Nano-Robotics
- ➡ Building Structures
- ➡ UAV's

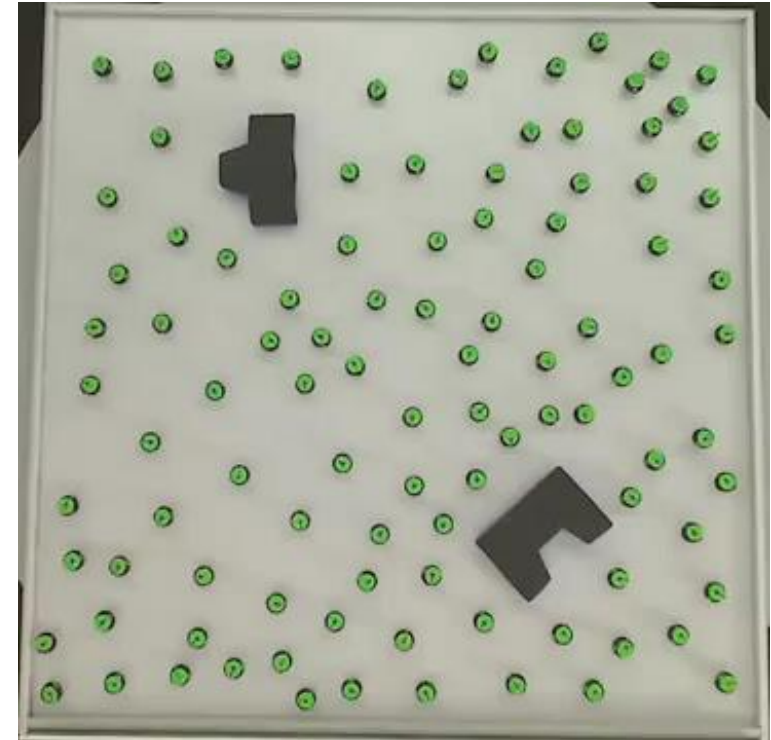


Interesting applications



Kilobots: Do a fun project with us!

HARVARD
UNIVERSITY



Conclusion



- ➡ With the rise of intelligent robotics, multi-agent systems will become more and more important
 - ➡ Interesting topic which is a lot of fun to study
 - ➡ But also some serious math...
 - ➡ The “serious” part of the lecture will start next week
- We hope you enjoy it 😊

