

## Teaching Robotics from a Computer Science Perspective

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### ABSTRACT

Most introductory robotics textbooks have been written from the mechanical engineering perspective. These texts spend hundreds of pages studying gears, motors, sensors, and other related topics. While a computer scientist needs to know something about these topics, he or she certainly is not concerned with them to the degree that the texts cover. Meanwhile, the texts leave out many of the topics that are the most interesting to computer scientists. This paper presents some ideas, resources, and references for those who may want to teach a Junior/Senior level Introduction to Robotics course from a computer science perspective without a textbook.

### INTRODUCTION

The field of robotics is still relatively new, and the robotics community continues to struggle over its scope. In much the same way that computer science grew out of mathematics and electronic engineering, robotics is emerging from computer science, applied mathematics, and mechanical engineering. Different disciplines view robots from different perspectives. For example, consider a robot arm programmed to use a video camera to view parts randomly dropped onto a conveyer belt, identify those parts that are misshapen, and quickly move the arm into position to pick up and discard the irregular parts. The interesting part of this system to the computer scientist is how to recognize the misshapen part in the first place, and quickly identify its location. Applied mathematicians have developed equations that compute the location of the robot manipulator (“the hand on the arm”) given the relative angles of its joints (forward kinematics) as well as the joint angles necessary to move the manipulator to a particular location in space (inverse kinematics). The mathematician must compute where the part will be (as the conveyer belt moves) by the time the robot can arrive at the part, and the kinematic equations necessary to place the arm at that location. Meanwhile, the mechanical engineer is concerned with ensuring that the motors and the gears are robust and quick enough to accomplish the task.

Historically, most robotics textbooks have been written from the mechanical engineering perspective. These texts spend hundreds of pages studying gears, motors, sensors, and other related topics. While a computer scientist needs to know something about these topics, he or she certainly is not concerned with them to the degree that the

texts cover. When I began searching for a textbook for to use in a Robotics class, I was disappointed at the lack of books written for computer science students on the market. This paper is the result of my experience teaching this course without a textbook to cover the core material, and presents some ideas, resources, and references for others who may want to teach such a course.

## SUGGESTED TOPICAL OUTLINE FOR AN INTRODUCTORY ROBOTICS COURSE

Some large universities have both the demand and the resources to teach courses like Robotics, AI, and Computer Vision every semester, or at least every year. Under these circumstances, requiring AI as a prerequisite for a Robotics class may be appropriate. But often in smaller departments courses are not offered with enough frequency to achieve this, and it is certainly possible to teach Robotics without assuming prior AI experience.

The Robotics class at Rowan university is designed for Junior and Senior computer science majors, and expects these students to have a solid mathematical background (including some calculus and linear algebra), as well as a basic background in programming, data structures, and algorithms. My goal is to provide students with an overview of the field of robotics, with particular emphasis on software for robotics.

The syllabus for this three-credit course (meeting twice a week for one hour and fifteen minutes) includes the following topics:

- Mathematics for Robotics
- Sensors & Actuators
- Practical Robot Laboratory Introduction
- AI for Robotics
- Robot Teleoperation
- Case Studies

The remainder of this paper will review each of these topics and present ideas, resources, and selected references to aid the development of a Robotics class for computer science majors.

All of the recommended readings included in this paper are available on the web. In order to fully cover all the suggested topics, the instructor will have to supplement these readings with class notes or short excerpts from textbooks, and selected other papers.

While not all of the recommended readings are downloadable for free, I have limited myself to two electronic databases that charge a fee: ACM's Digital Library, and IEEE's Xplore. Many college and university libraries subscribe to these databases. Furthermore, the majority of the papers that are not freely available have copyright notices that allow copying for educational purposes (and thus, only incur a one-time fee when downloaded by the instructor). I also encourage instructors to consider requiring students to join the ACM as student members (a worthwhile membership for any computer science student), giving students access to the entire digital library and a host of other benefits, for much less than the cost of a single textbook.

## MATHEMATICS FOR ROBOTICS

We begin the semester by discussing homogeneous transformations, and coordinate frames. We move on to cover forward kinematics, but skip the more complex inverse kinematics. Alonzo Kelly published an excellent technical report [15] that gives a very careful description of coordinate frames and transformations, together with forward and inverse kinematics and more. I recommend that you only cover pages 1-16: coordinate frames and forward kinematics.

Later in the semester, we discuss calibration (including hand-eye calibration and calibration for mobile robots), triangulation ranging, and position estimation.

## SENSORS & ACTUATORS / PRACTICAL ROBOTIC LABORATORY INTRODUCTION

While our course does not include a weekly laboratory period, students cannot have an understanding of robotics until they have tried to program their own robots. Our Robotics class includes laboratory exercises that the students do outside of the classroom in a small laboratory we have equipped. We use the Handy Board [8], a 6811-based microcontroller system that provides input ports for sensors and output ports for motors. Students build a robot base to support the Handy Board using Lego bricks, gears, motors and wheels, and write software in Interactive C [12]. Kumar and Meeden used a similar setup for an Artificial Intelligence course, which they describe in [18]. They also have an extensive on-line resource kit that provides more detail [28].

A less expensive option for a laboratory is the Lego Mindstorms [20] system. The Lego Mindstorms kit comes with its own visual programming environment, which is almost certainly too limited for use in this type of course. However several open source alternatives exist for programming the Mindstorms in a wide variety of languages including Ada, C, Scheme, and Java. O'Hara and Kay provide a survey of open source software for educational robotics in [24]. Patterson-McNeill and Binkerd discuss the Mindstorms environment in more detail in [25]. Many others have reported their experiences using Mindstorms in more introductory computer science courses. [2] [6] [7] [34]

More advanced robots such as Kheperas [13] and Pioneers [29] are certainly also an option, though the price is probably beyond that of most smaller departments. Harlan, Levine, and McClarigan have developed a class interface for use with Kheperas [9].

In the first few weeks of class I generally alternate lectures on mathematics for robots with an introduction to the hardware we will use in class. This naturally leads into a discussion of sensors and actuators, both those included in student kits as well as more sophisticated versions.

Both the Handy Board and Mindstorms systems require students to have some competency with Lego design. Fred Martin has written an excellent introduction to Lego design [21] that really helps the student (or instructor) who may not have had extensive experience with Lego as a child.

Fred Martin has also written a robotics textbook [22] that I used in one of my classes. While the text has some very helpful sections, most of the contents are geared more towards engineers. It is a very useful book to have on reserve in the library, but I have no plans to require students to purchase it for future classes.

## AI FOR ROBOTICS

My goals in this section are to teach students something about learning, planning, and search. I also like to include a section on Neural Networks so that I can include a Neural Network-based mobile robot in my case studies section.

I tend to use a lot of class notes for this section, supplemented with small excerpts from a few AI textbooks. In addition, Ciesielski & McDonald have developed a tool that is available on the web [1]. This tool allows you to view a graphical demonstration of several search algorithms. The web site also includes a set of slides that you can use to help teach AI search techniques to your students. Ciesielski & McDonald have also written a paper describing their tool [4].

The D\* algorithm is one that I enjoy teaching. Stentz's paper on D\* [31] is not one that you can give to an undergraduate and expect them to follow the algorithm. However, I like the ideas behind the algorithm so much, that I do use this paper. I encourage the students to listen to my lecture before trying to follow the paper, and rather than require them to understand the algorithm completely, I am more concerned with them understanding why there is a need for such an algorithm, and the general way it operates.

Kevin Knight wrote an article for CACM [17] introducing Neural Networks that is written for a general computer science audience. I generally introduce this topic immediately before the Neural Network example in the case studies section below.

While I use AI as only a part of my course, others have taught entire AI courses using Robotics. In addition to Kumar and Meeden's work mentioned above [18], both Klassner [16] and Imberman [11] have used Robots in the context of their Artificial Intelligence courses. Computer scientists who wish to teach an entire course on AI for Robotics may also wish to consider Robin Murphy's textbook. [23]

## ROBOT TELEOPERATION

With the popularity of battling robots on television today, it is worth taking some time to discuss with students the ideas behind robot teleoperation. Students are surprised that I am not a fan of these shows. While I find the robots physically interesting, they are so lacking in intelligence as to not be of much interest to me.

I am, however, tremendously interested in semi-autonomous teleoperation. Sharon Laubach presents the teleoperation (using 3D data) of the Sojourner rover from the NASA Mars Pathfinder mission in a paper from ACM Crossroads [19]. Kay and Thorpe present a 2D alternative in their paper describing the STRIPE system [14].

## CASE STUDIES

The diversity of robot research provides an enormous selection of technical papers. The difficulty, of course, is finding papers that are well written and suitable for undergraduates.

A relatively recent CACM special issue on Robotics has several worthwhile papers in it. Rodney Brooks considers issues in humanoid robots in his paper [3], primarily through two examples (Kismet and Cog) from MIT's AI lab. The paper includes some interesting discussion of human vision. Along with this article you might want to reference the Humanoid Robotics group at MIT [10], or other humanoid robot projects mentioned in the paper.

By building bigger robots out of smaller modules, Rus et al [30] describe how robots can reconfigure themselves for different tasks, and can cope with the failure of an individual module. Along with this article, you might want to reference the Dartmouth Robotics Lab web site.[5]

Sebastian Thrun's paper on Probabilistic Robotics [32] requires that students have a strong background in probability, but I think it is a good one nonetheless. Students in most classes will have experience in the impreciseness of their robots, and will be greatly relieved to find out that techniques for coping with a range of possible locations exist.

Manuela Veloso's paper on Entertainment Robotics [33] is a fun paper that your students will love. If you have any sort of a competition of your own, this will give students a glimpse at the next level. The focus is on Robot soccer and the Robocup [27] competitions.

I believe that Dean Pomerleau's use of Neural Networks in Robotics [26] is worth taking a look at, time permitting. While this paper is getting on in years, it is the most accessible reference that I've found that gives an overview of some of the possibilities of the field.

## CONCLUSION

Teaching a class without the appropriate textbook is a daunting task. When I began preparing for my first semester teaching Robotics, I questioned whether undergraduates, even Juniors and Seniors, would be comfortable with reading papers rather than a textbook.

The responses of the students in my Robotics classes have been overwhelmingly positive. Students enjoy the balance of robotics theory and the practical challenges of building and programming a robot. While they are not always able to understand everything in the papers when they read them for the first time, careful classroom lectures combined with their excitement about the field encourages them to persevere. I hope that the ideas, references, and resources presented in this paper encourage more faculty to develop similar courses.

## REFERENCES

- [1] *AI-Search Algorithm Animation Project @ RMIT-CS Australia*, <http://www.cs.rmit.edu.au/AI-Search/> [accessed March 2003].
- [2] David J. Barnes, *Teaching Introductory Java through LEGO MINDSTORMS Models*, Proceedings of the 33rd SIGCSE Technical Symposium on Computer Science Education, 2002. Available at: <http://doi.acm.org/10.1145/563340.563397>
- [3] Rodney Brooks, *Humanoid Robots*, Communications of the ACM, Vol. 45, No. 3 (March 2002). Available at: <http://doi.acm.org/10.1145/504729.504751>
- [4] Vic Ciesielski and Peter McDonald, *Using Animation of State Space Algorithms to Overcome Student Learning Difficulties*, in Proceedings of the 6th Annual Conference on Innovation and Technology in Computer Science Education, 2001. Available at: <http://doi.acm.org/10.1145/377435.377495>
- [5] Dartmouth College Robot Lab, <http://www.cs.dartmouth.edu/~robotlab/index.html> [accessed March 2003].
- [6] Barry Fagin and Laurence Merkle, Measuring the effectiveness of robots in teaching computer science, Proceedings of the 34th SIGCSE technical symposium on

Computer science education, 2003. Available at:  
<http://doi.acm.org/10.1145/611892.611994>

[7] Barry S. Fagin, Laurence D. Merkle, and Thomas W. Eggers, *Teaching Computer Science with Robotics Using Ada/Mindstorms 2.0*, Proceedings of the 2001 Annual ACM SIGAda International Conference on Ada, 2001. Available at:  
<http://doi.acm.org/10.1145/507574.507592>

[8] *The Handy Board*, <http://www.handyboard.com/> [accessed March 2003].

[9] Robert M. Harlan, David B. Levine, and Shelley McClarigan, *The Khepera Robot and the kRobot Class: A Platform for Introducing Robotics in the Undergraduate Curriculum*, Proceedings of the Thirty-Second SIGCSE Technical Symposium on Computer Science Education, 2001. Available at:  
<http://doi.acm.org/10.1145/364447.364553>

[10] Humanoid Robotics Group, <http://www.ai.mit.edu/projects/humanoid-robotics-group/> [accessed March 2003].

[11] Susan P. Imberman, *Teaching neural networks using LEGO handy board robots in an artificial intelligence course*, Proceedings of the 34th SIGCSE Technical Symposium on Computer Science Education, 2003. Available at:  
<http://doi.acm.org/10.1145/611892.611995>

[12] *Interactive C*, <http://www.newtonlabs.com/ic/> [accessed March 2003].

[13] *K-Team: Khepera II Mini Robot*, <http://www.k-team.com/robots/khepera/> [accessed March 2003]

[14] Jennifer S. Kay and Charles E. Thorpe, *STRIFE: Supervised TeleRobotics Using Incremental Polygonal Earth Geometry*, 3rd International Conference on Intelligent Agents, 1993, available at: <http://www-2.cs.cmu.edu/~jennie/ias3.html>

[15] Alonzo Kelly, *Essential Kinematics for Autonomous Vehicles*, Carnegie Mellon University Robotics Institute Technical Report CMU-RI-TR-94-14 (May 1994). Available at: [http://www.frc.ri.cmu.edu/~alonzo/pubs/reports/pdf\\_files/kinematics.pdf](http://www.frc.ri.cmu.edu/~alonzo/pubs/reports/pdf_files/kinematics.pdf)

[16] Frank Klassner, *A case study of LEGO Mindstorms™ suitability for artificial intelligence and robotics courses at the college level*, Proceedings of the 33rd SIGCSE Technical Symposium on Computer Science Education, 2002. Available at:  
<http://doi.acm.org/10.1145/563340.563345>

[17] Kevin Knight, *Connectionist ideas and algorithms*, Communications of the ACM, Vol. 33, No. 11 (November 1990). Available at:  
<http://doi.acm.org/10.1145/92755.92764>

[18] Deepak Kumar and Lisa Meeden, *A Robot Laboratory for Teaching Artificial Intelligence*, The Proceedings of the Twenty-ninth SIGCSE Technical Symposium on Computer Science Education (SIGCSE-98), Daniel Joyce, Editor, ACM Press, 1998. Available at: <http://mainline.brynmawr.edu/Robots/ResourceKit/Paper.html>

[19] Sharon Laubach, *Mars Rovers: July 4, 1997, and Beyond*, ACM Crossroads Student Magazine, Spring 1998. Available at:  
<http://www.acm.org/crossroads/xrds4-3/rover.html>

[20] Lego Mindstorms, <http://mindstorms.lego.com/eng/default.asp> [accessed March 2003].

[21] Fred G. Martin, *The Art of LEGO Design*, The Robotics Practitioner: The Journal for Robot Builders, Vol. 1, No. 2 (Spring 1995). Available at:  
<ftp://cherupakha.media.mit.edu/pub/people/fredm/artoflego.pdf>

- [22] Fred G. Martin, Robotic Explorations: A Hands-On Introduction to Engineering, Prentice Hall, 2001.
- [23] Robin R. Murphy, Introduction to AI Robotics, MIT Press, 2000.
- [24] Keith J. O'Hara and Jennifer S. Kay, *Investigating Open Source Software and Educational Robotics*, The Journal of Computing Sciences in Colleges, Vol. 18, No. 3, February 2003.
- [25] Holly Patterson-McNeill and Carol L. Binkerd, *Resources for using Lego Mindstorms*, Proceedings of the Seventh Annual Consortium for Computing in Small Colleges Central Plains Conference, 2001.
- [26] Dean A. Pomerleau, *Neural Networks for Intelligent Vehicles*, Intelligent Vehicles '93 Symposium, (July 1993), Available in IEEE Xplore at: <http://ieeexplore.ieee.org/Xplore/DynWel.jsp>
- [27] *Robocup*, <http://www.robocup.org/>, [accessed March 2003].
- [28] A Robot Laboratory for Teaching Artificial Intelligence Resource Kit, <http://mainline.brynmawr.edu/Robots/ResourceKit/>, [accessed March 2003].
- [29] Robots and Robotics Accessories, <http://www.activrobots.com/> [accessed, March 2003]
- [30] Daniela Rus, Zack Butler, Keith Kotay, and Marsette Vona, *Self-reconfiguring Robots*, Communications of the ACM, Vol. 45, No. 3 (March 2002). Available at: <http://doi.acm.org/10.1145/504729.504752>
- [31] Anthony Stentz, *Optimal and Efficient Path Planning for Partially-Known Environments*, Proceedings of the IEEE International Conference on Robotics and Automation (May 1994). Available at: <http://www.frc.ri.cmu.edu/~axs/doc/icra94.pdf>
- [32] Sebastian Thrun, *Probabilistic Robotics*, Communications of the ACM, Vol. 45, No. 3 (March 2002). Available at: <http://doi.acm.org/10.1145/504729.504754>
- [33] Manuela Veloso, *Entertainment Robotics*, Communications of the ACM, Vol. 45, No. 3 (March 2002). Available at: <http://doi.acm.org/10.1145/504729.504755>
- [34] Ursula Wolz, *Teaching Design and Project Management with Lego RCX Robots*, Proceedings of the Thirty-Second SIGCSE Technical Symposium on Computer Science Education, 2001. Available at <http://doi.acm.org/10.1145/364447.364551>