The following are recent papers in cognitive robotics recommended by many of the key researchers in the field. We recommend that you draw upon this reading list during the development of your advanced lecture and course project.

Note that many of these references are only partial, but they should offer clues as to where to look. Also take ample advantage of the web's search capabilities. Most authors these days post their recent papers.

In many fields high quality technical papers appear in journals. In the field of artificial intelligence you'll find most of the cutting edge research in conferences, most of which are considered journal quality. Conferences relevant to intelligent embedded systems include the National Conference on Artificial Intelligence (AAAI), International Joint Conference on Artificial Intelligence (IJCAI), Autonomous Agents (AA), Artificial Intelligence in Planning and Scheduling (AIPS), Reasoning Under Uncertainty (UAI), Knowledge Representation and Reasoning (KRR), Machine Learning (ML), and Hybrid Systems (HS).

There are many parallel journals, including the venerable *Artificial Intelligence Journal* (*AIJ*), and the more hip, online *Journal of Artificial Intelligence Research (JAIR)*, *Machine Learning*, and the *Journal of Constraint Systems*.

The following suggested papers and URLs are provided thanks to:

Craig Boutilier, Adnan Darwiche, Vineet Gupta, Leslie Kaelbling, Henry Kautz, Pandu Nayak, Judea Pearl, Bart Selman, Dave Smith, Manuela Veloso, Dan Weld and Feng Zhao.

Cognitive Robotics

Robotic Soccer

- 1. Asada, and Kitano, eds. *RoboCup-98: Robot Soccer World Cup II*. New York, NY: Springer Verlag Telos, 1999. ISBN: 3540663207.
- Veloso, Manuela, Michael Bowling, Sorin Achim, Kwun Han, and Peter Stone. <u>The CMUnited-98 Champion Small Robot Team</u>. Edited by Asada, and Kitano. pp. 77-92.
- 3. <u>Cornell Robocup</u>.

Autonomous Space Probes

1. <u>Remote Agent Autonomous Control Experiment</u>.

Reactive Programming

Esterel and Lustre are the primary languages, and are doing very well for embedded systems programming.

1. <u>Esterel Language Page</u>. *This page distributes the entire Esterel system, and has papers and pointers to the other languages.*

State Estimation and Mapping

- 1. Se, Stephen, David Lowe, and Jim Little. "Mobile Robot Localization and Mapping with Uncertainty Using Scale-Invariant Visual Landmarks." *International Journal of Robotics Research* 21, no. 8 (2002): 735-758. *Vision-based localization.*
- 2. Thrun, S., D. Fox, W. Burgard, and F. Dellaert. "Robust Monte Carlo Localization for Mobile Robots." *Artificial Intelligence* 128, no. 1 and 2 (2001). *A hybrid approach to particle filters for localization*.
- Newman, Paul M., and John J. Leonard. "Consistent Convergent Constant Time SLAM." *International Joint Conference on Artificial Intelligence*. Acapulco, Mexico. August 2003. *A constant-time map-building algorithm.*
- Thrun, S., D. Koller, Z. Ghahramani, H. Durrant-Whyte, and A. Y. Ng.
 "Simultaneous Mapping and Localization with Sparse Extended Information Filters: Theory and Initial Results." In Workshop on Algorithmic Foundations of Robotics. Nice, France, 2002.

Another constant-time map-building algorithm.

- 5. Paskin, Mark A. "Thin Junction Tree Filters for Simultaneous Localization and Mapping." *Proceedings of the Eighteenth International Joint Conference on Artificial Intelligence*. Edited by G. Gottlob, and T. Walsh. 2003. *Yet another constant map-building algorithm.*
- 6. Verma, Vandi, Geoff Gordon, Reid Simmons, and Sebastian Thrun. "Particle Filters for Rover Fault Diagnosis." *IEEE Robotics & Automation Magazine special issue on Human Centered Robotics and Dependability*, June 2004. *Fault State Estimation*.
- 7. Pasula, Hanna, Stuart Russell, Michael Ostland, and Ya'acov Ritov. "Tracking Many Objects with Many Sensors." *Proc. IJCAI-99.* Stockholm. 1999. *Traffic state estimation using particle filters and Bayesian estimation.*

Constraint Programming

There are many materials available on constraint programming.

- 1. Mariott, Kim and Peter Stuckey. *Programming with Constraints: An Introduction*. Cambridge, MA: MIT Press, 1998. ISBN: 0262133415.
- 2. Hentenryck, Van, Saraswat et al. "Strategic Directions in Constraint Programming." *ACM Computing Surveys*, 1996. (In Directory).

Reinforcement Learning

Surveys

 Kaelbling, Leslie Pack, Michael L. Littman, and Andrew W. Moore. "Reinforcement Learning: A Survey." *Journal of Artificial Intelligence Research* 4 (1996): 237-285.

Very nice short survey of reinforcement learning.

- Sutton, Richard S., and Andrew G. Barto. <u>Reinforcement Learning: An</u> <u>Introduction.</u> Cambridge, MA: MIT Press, 1998. ISBN: 0262193981. A very nice treatment of reinforcement learning from an introductory level: very well presented and an easy read.
- 3. Bertsekas, Dimitri P., and John. N. Tsitsiklis. *Neuro-dynamic Programming*. Belmont, MA: Athena, 1996. *Reinforcement learning in much more detail (a bit less accessible as an introduction than Sutton's book, but very comprehensive in the treatment of approximation)*.

Some Classics

- 1. Watkins, Christopher, J. C. H., and Peter Dayan. "Q-Learning." *Machine Learning* 8 (1992): 279-292.
- Moore, Andrew W., and Christopher G. Atkeson. "Prioritized Sweeping -Reinforcement Learning with Less Data and Less Time." *Machine Learning* 13 (1993): 103-130.
- . "The Parti-game Algorithm for Variable Resolution Reinforcement Learning in Multidimensional State Spaces." *Machine Learning* 21 (1995): 199-234.

Use of Function Approximation For Reinforcement Learning

- 1. Tesauro, Gerald J., TD-Gammo. "A Self-teaching Backgammon Program, Achieves Master-Level Play." *Neural Computation* 6 (1994): 215-219.
- 2. Tsitsiklis, John H., and Benjamin Van Roy. "Feature-Based Methods for Large Scale DynamicProgramming." *Machine Learning* 22 (1996): 59-94.

Decision Theoretic Planning and Markov Decision Processes

Surveys

1. Blythe. *AI Magazine* 20, no. 2. *Short survey.*

2. Boutilier, Craig, Thomas Dean, and Steve Hanks. "Decision Theoretic Planning: Structural Assumptions and Computational Leverage." Journal of Artificial Intelligence Research 11 (1999): 1-94. Longer survey covering AI-style representation and solution methods.

The Use of Search Techniques to Solve MDPs

1. Barto, A. G., S. J. Bradtke, and S. P. Singh. "Learning to Act using Real-Time Dynamic Programming." Artificial Intelligence 72, issue 1-2 (1995): 81-138.

The Use of AI Style Representations and Planning-style Abstraction and **Regression Techniques**

- 1. Dearden, Richard, and Craig Boutilier. "Abstraction and Approximate Decision Theoretic Planning." Artificial Intelligence 89 (1997): 219-283. Also see AAAI-94.
- 2. Boutilier, Craig, Richard Dearden, and Moises Goldszmidt. "Stochastic Dynamic Programming with Factored Representations." Artificial Intelligence. To appear, 1999. (See also IJCAI-95).

The Use of Sampling Techniques

1. Kearns, Michael, Yishay Mansour, and Andrew Y. Ng. "A Sparse Sampling Algorithm for Near-optimal Planning in Large Markov Decision Processes." IJCAI 1999. Stockholm, pp. 1324-1331.

Partially Observable Markov Decision Processes

Surveys

- 1. Lovejoy, William S. "A Survey of Algorithmic Methods for Partially Observed Markov Decision Processes." Annals of Operations Research 28 (1991): 47-66.
- 2. Monahan, George E. "A Survey of Partially Observable Markov Decision Processes: Theory, Models and Algorithms." Journal of Management Science 28 (1982): 1-16.

Incremental Pruning for POMDPs

1. Cassandra, Anthony R., Michael L. Littman, and Nevin L. Zhang. "Incremental Pruning: A Simple, Fast, Exact Method for POMDPs." UAI. Providence, RI (1997): 54-61.

Makes a big computational difference.

State of the Art

- 1. Poupart, Pascal, and Craig Boutilier. "Value-directed Compression of POMDPS." *NIPS*. Vancouver, BC (2003): 1547-1554. *Linear compression of POMDPS*.
- 2. Pineau, Joelle, Geoff Gordon, and Sebastian Thrun. "Point-Based Value Iteration: An Anytime Algorithm for POMDPs." *IJCAI*. Acapulco, Mexico 2003. *The fastest solver of large POMDPs available*.

Model-based Autonomous Systems

Diagnosis, Repair and Control

- 1. Hamscher, W., L. Console, and J. de Kleer, eds. *Readings in Model-based Diagnosis*. San Mateo, CA: Morgan Kaufman, 1992. ISBN: 1558602496.
- 2. Proceedings of the International Workshop on Principles of Diagnosis.

Qualitative Modeling and Simulation

- 1. Weld, D., and J. de Kleer, eds. *Readings in Qualitative Reasoning About Physical Systems*. San Mateo, CA: Morgan Kaufman, 1990. ISBN: 1558600957
- 2. Kleer, J. de, and B. Williams, ed. "Special Issue on Qualitative Reasoning About Physical Systems II." *Artificial Intelligence* 51 (1991).
- 3. Proceedings of the International Workshop on Qualitative Reasoning about Physical Systems.

Planning with Discrete Events

Surveys

- 1. Weld, Daniel. "An Introduction to Least-commitment Planning." *AI Magazine*, Winter 1994, 27-61.
- 2. ——. "Recent advances in AI planning." *AI Magazine*, Summer 1999. *Covers satplan, graphplan, sat engines and reactive planning and execution.*
- 3. Rao, Recent Planning Tutorial at AAAI or IJCAI.
- 4. Proceedings of the International Conference on Artificial Intelligence Planning and Scheduling Systems.

Causal Link Planning

- 1. See Weld Survey, 1994.
- 2. Veloso, Manuela, and Jim Blythe. "Linkability: Examining Causal Link Commitments in Partial-order Planning." *Proceedings of the Second International Conference on AI Planning Systems* (June 1994): 170-175.

Planning as Propositional Satisfiability

- 1. Kautz, and Selman. On Satplan Planner.
- 2. ——. On Black Box Constraint Solver.

Graphplan

1. Blum, A., and Furst, M. L. "Fast Planning Through Planning Graph Analysis." *Proc. IJCAI-95* (1995). Montreal, Canada.

Conditional Planning

- 1. Geffner, Hector. AIPS submission, 2000?
- Weld, SGP paper, AAAI (1998). Has a free lisp implementation, but it's not super scalable i.e. O (number of possible worlds). Paper is pretty technical.

Model-based Reactive Planning

- 1. Williams, B. C., and P. P. Nayak. "A Reactive Planner for a Model-based Executive." *Proceedings of the International Joint Conference on Artificial Intelligence*, Nagoya, Japan, 1997.
- Jensen, Rune, and Manuela Veloso. "OBDD-based Universal Planning: Specifying and Solving Planning for Synchronized Agents in Non-deterministic Domains." *Journal of Artificial Intelligence Research*, 2000. (To appear)

Interleaved Planning and Execution

- 1. Ambros-Ingerson, J., and S. Steel. "Integrating Planning, Execution, and Monitoring." *AAAI* (1988): 735-740.
- 2. Keith Golden, paper in International Conference on AI Planning and Scheduling, 1998?
- 3. James Firby, An Investigation into Reactive Planning in Complex Domains. *AAAI* (1987?): 202-206.
- 4. Simmons, Reid. Task Control Architecture. See Reid Simmons Web page.
- 5. Georgeff, and Lansky. <u>Procedural Reasoning System</u>.

Learning in Planning and Execution

- 1. Veloso, Manuela, Jaime Carbonell, M. Alicia Perez, Daniel Borrajo, Eugene Fink, and Jim Blythe. "Integrating Planning and Learning: The PRODIGY Architecture." *Journal of Experimental and Theoretical Artificial Intelligence* 7, no. 1 (1995): 81-120.
- 2. Haigh, Karen, and Manuela Veloso. "Learning Situation-dependent Costs: Improving Planning from Probabilistic Robot Execution." *Robotics and Autonomous Systems*. 1999.

- 3. Blythe, Jim, and Manuela Veloso. "Analogical Replay for Efficient Conditional Planning." *Proceedings of AAAI-97* (1997): 668--673.
- 4. Lenser, Scott, and Manuela Veloso. "Sensor Resetting Localization for Poorly Modelled Mobile Robots." *ICRA-2000.* (To Appear)

Planning and Execution with Resources and Time

Survey

1. Smith, Frank, and Jonsson. "Bridging the gap between planning and scheduling." Survey Paper.

Temporal Planning

- 1. Weld, and Smith. "Paper on Temporal Graphplan." IJCAI (1999).
- 2. Jonsson, Morris, Muscettola, and Rajan. "Paper on the remote agent planner." *AIPS* (2000).
- 3. Penberthy, and Weld. "Paper on Zeno." AAAI (1994).
- 4. Joslin, and Pollack. "Paper on Descarte." AAAI (1996).

Scheduling

1. Beck, and Fox. AI Magazine 19, no. 4.

Metric Quantities

- 1. Wolfman, and Weld. "Paper on LPSAT." *IJCAI* (1999).
- 2. Kautz, and Walser. "Paper on ILP Planning." AAAI (1999).
- 3. Vossen et al. *IJCAI* (1999).
- 4. Penberthy, and Weld. "Paper on Zeno." AAAI (1994).

Executing Temporal Plans

Muscettola and Others on Efficient Plan Running. See Professor Williams for suggested papers.

Bayesian Networks in Embedded Systems

- 1. Daphne Koller et al. "Object-Oriented Bayesian Networks." UAI (1997). A structured language for Bayes nets (best student paper award).
- 2. _____. "Effective Bayesian Inference for Stochastic Programs." AAAI (1997). A general inference procedure.
- 3. Pearl, Judea. *New Book on Causality*. Chapter 1. <u>Homepage: Judea Pearl</u>. *Overview of the transition from probabilistic to causal Bayesian nets*.

UAI-oriented Graduate Class Web Pages with Tutorials, Class Notes, Links to Free Software, etc. Common Core Includes Basic Semantics of Bayes Nets and Inference. Many Expand on Advanced Inference and Learning:

- 1. Stanford
- 2. <u>Duke</u>

Multi-agent Systems

Surveys

1. Stone, Peter, and Manuela Veloso. "Multiagent Systems: A Survey from a Machine Learning Perspective." *Autonomous Robots* (2000). To Appear.

Automated Verification

Symbolic Model Checking

- 1. McMillan, Ken. *Symbolic Model Checking*. Kluwer Publishers. *The key book in the area he started it all.*
- 2. Edmund Clark group at CMU.

Satisfiability and Compilation in Verification

- 1. Jackson, Daniel. Nitpick system. MIT.
- 2. Recent Work by Vardi and Colleagues on Model Checking.

Hybrid Systems

- 1. Alur, Courcoubetis, Halbwachs et al. "The Algorithmic Analysis of Hybrid Systems." *Theoretical Comp. Sci.* 138 (1995). *This is the basic paper which lays out the definition of hybrid automata, proves the undecidability of verification, and has some simple examples.*
- Henzinger, Kopke, Puri, and Varaiya. "What is decidable about Hybrid Automata?" *Journal of Computer and System Sciences* 57, no. 1 (August 1998): 94-124.

Summarizes the state of the art in the area.

- 3. Henzinger, Ho, and Wong-Toi. <u>HyTech</u>. *Hytech is the best known engine for Hybrid verification - you can easily teach the algo in 15 minutes in a lecture.*
- 4. Alur, and Dill. "A Theory of Timed Automata." *Theoretical Comp. Sci.* (1994). *The key paper on Timed automata. Beautifully written too*!
- 5. Nerode, and Kohn. Work on Topological Structures for Hybrid Systems.
- 6. Ansaklis et al. Work on Petri Net Model for Hybrid Systems.

- 7. Berkeley 's Work (Shankar Sastry, Claire Tomlin et al.): Timed Finite State Automata, Optimization Methods.
- 8. Caine's Work (at McGill) on Partition Systems. (*similar to the phase space partition work of Feng Zhao*).

Fast Deduction and Search

Fast Propositional Satisfiability Algorithms

- 1. Bayardo Jr., R. J., and Schrag, R. C. "Using CSP Look-back Techniques to Solve Real World SAT Instances." *Proc. AAAI-97*. (1997) Portland, OR.
- 2. Li, Chu Min, and Anbulagan. "Heuristics Based on Unit Propagation for Satisfiability Problems." *Proc. IJCAI-97* (1997). Nagoya, Japan.
- 3. Selman, B., H. Kautz, and B. Cohen. "Noise Strategies for Local Search." *Proc. AAAI-94* (1994). Seattle, WA.
- 4. Nayak, and Williams. "Incremental Truth Maintenance." AAAI (1998?).

Randomized Systematic Search (Heavy Tails)

1. Gomes, C. P., Selman, B., and Kautz, H. "Boosting Combinatorial Search Through Randomization." *Proc. AAAI-98* (1998). Madison, WI.

Knowledge Compilation and Theory Approximation

Selman and Kautz

1. Knowledge Compilation and Theory Approximation

Schaerf, Cadoli, & Liberatore

- 1. Liberatore KR-1998, On the Compilability of Diagnosis, Planning, Reasoning about Actions, Belief Revisions, etc.
- 2. Many others by Liberatore, with similar worst-case negative results.
- 3. Cadoli, Survey on knowledge compilation, ACM. The standard reference, although a bit has happened since then. The specific reference appears in the Darwiche paper on compiling to DNNF.