



# Artificial Intelligence: Past, Present, and Future



# Plan for Today

- **Part I**

AI History and Review Select Applications

The Future: where do we go from here?

- **Break** (student evals)

- **Part II**

Emerging Area in AI :

“Brain Computer Interfaces”

Guest lecture by Dr. Reinhold Scherer



# A long time ago in a galaxy far away...



August 31, 1955

## DARTMOUTH SUMMER RESEARCH PROJECT ON ARTIFICIAL INTELLIGENCE

J. McCarthy, Dartmouth College

M.L. Minsky, Harvard University

N.Rochester, I.B.M. Corporation

C.E. Shannon, Bell Telephone Laboratories

"We propose that a 2 month, 10 man study of artificial intelligence ... An attempt will be made to find how to make machines use language, form abstractions and concepts, solve kinds of problems now reserved for humans, and improve themselves.

We think that a significant advance can be made in one or more of these problems if a carefully selected group of scientists work on it together *for a summer.*"



# Samuel's Checkers program (1959)



- First self-learning AI program
- Used *search tree* of board positions reachable from current position





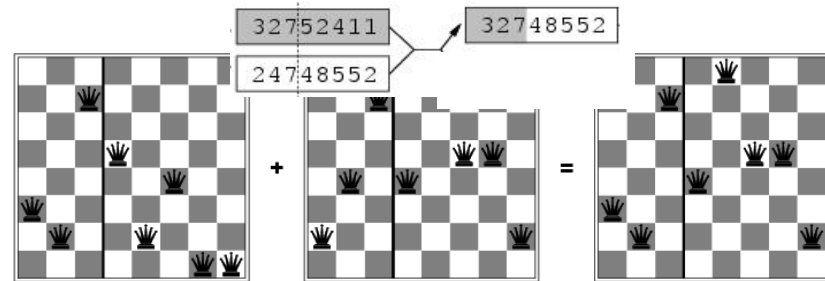
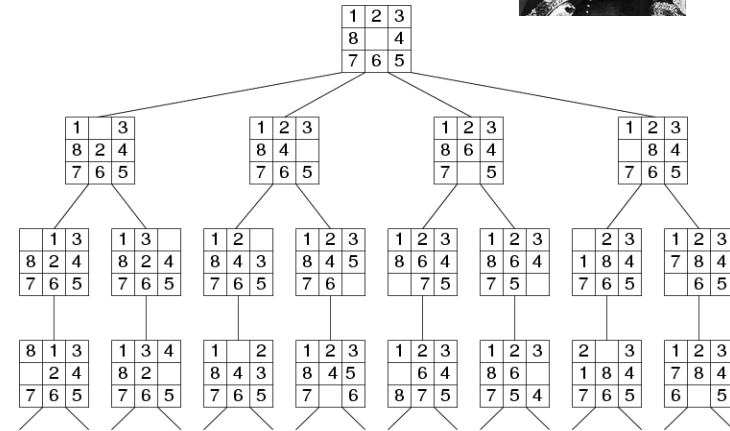
# Flashback: Search



- **Uninformed Search**  
DFS and BFS Iterative Deepening Bidirectional Search

- **Informed Search**  
Best first search: Greedy, A\*, admissible heuristics

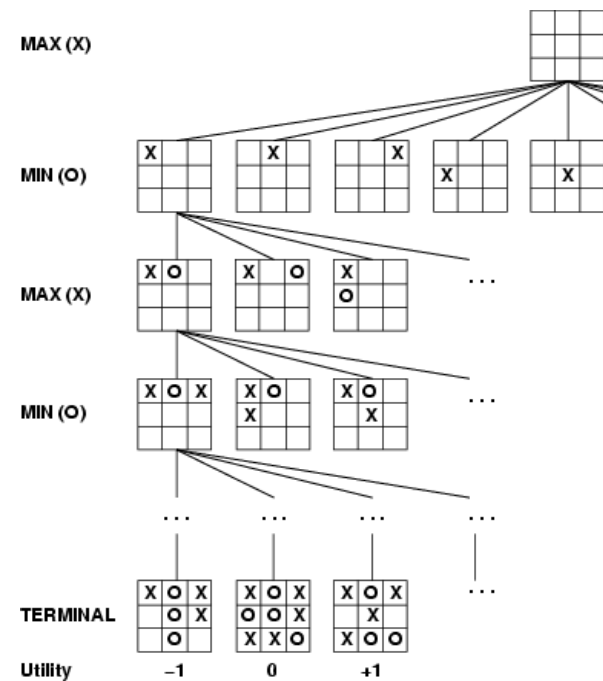
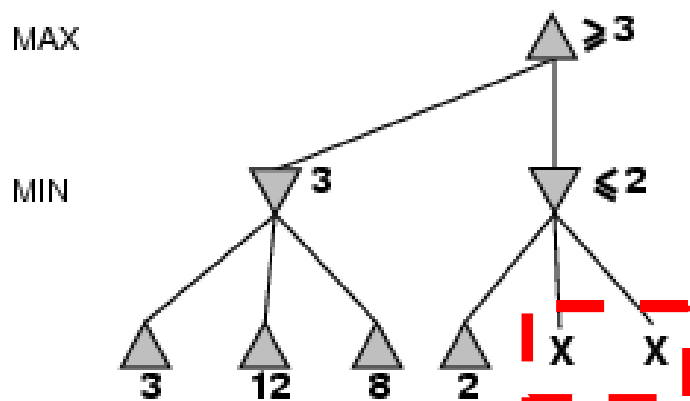
- **Local Search**  
Hill Climbing Simulated Annealing Genetic Algorithms





# Flashback: Adversarial Search

- Minimax Search
- Alpha Beta Pruning
- Truncated search and evaluation functions





# Samuel's Checkers program (1959)

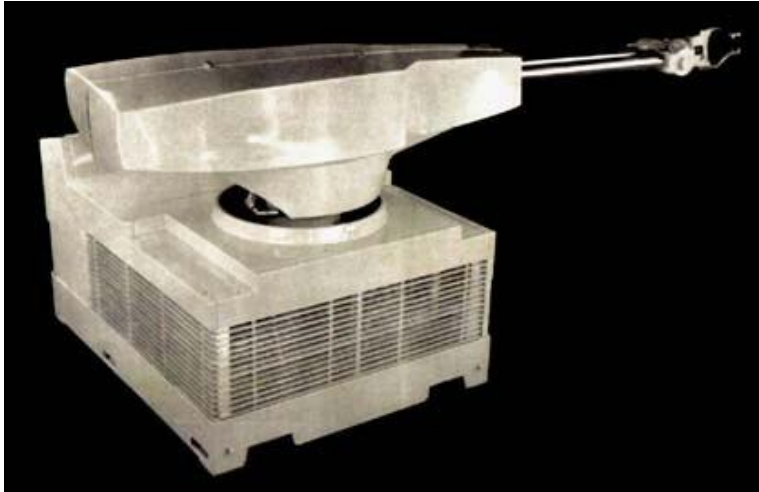


- First use of minimax search
- First use of alpha-beta pruning
- First use of truncated search and evaluation functions
- First use of machine learning
- Implemented on an IBM 701 with 9 KB memory!
- IBM's stock went up 15 points after demo





# 1961: First Industrial Robot



- Worked on a General Motors assembly line
- Transported die castings from assembly line and welded these onto auto bodies

## **Unimate by Unimation**

- Began the era of industrial robots

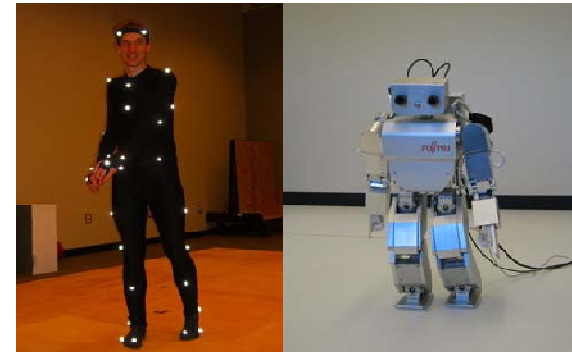




# Flashback: Robots today



- Invited Talks by:
- Dieter Fox (Probabilistic localization in robots)
- Rawichote Chalodhorn (Robot programming by human demonstration)





# Math Flashback: Recursive Bayesian Updating

$$P(x_n | z_1, \mathbf{K}, z_n) = \frac{P(z_n | x_n, z_1, \mathbf{K}, z_{n-1}) P(x_n | z_1, \mathbf{K}, z_{n-1})}{P(z_n | z_1, \mathbf{K}, z_{n-1})}$$

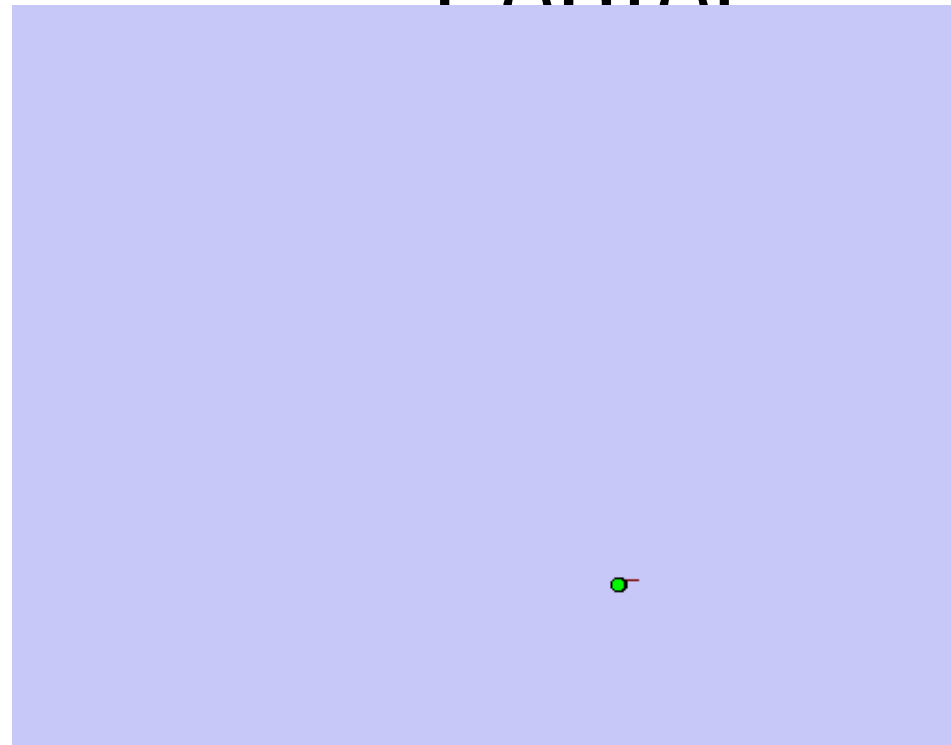
**Markov assumption:**  $z_n$  is independent of  $z_1, \dots, z_{n-1}$  if we know  $x$ .

$$\begin{aligned} P(x_n | z_1, \mathbf{K}, z_n) &= \frac{P(z_n | x_n) P(x_n | z_1, \mathbf{K}, z_{n-1})}{P(z_n | z_1, \mathbf{K}, z_{n-1})} \\ &= \alpha P(z_n | x) \sum_{x_{n-1}} P(x_n | x_{n-1}) P(x_{n-1} | z_1, \mathbf{K}, z_{n-1}) \end{aligned}$$

*normalize*      *New data*      *Dynamics*      *Previous estimate*



# Application: Robot Localization and Mapping of Allen Center

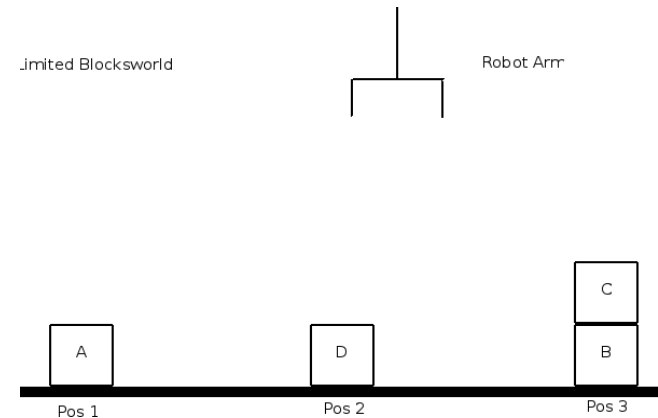


(Work of Prof. Dieter Fox and students)



# 1971: Dawn of Classical Symbolic AI

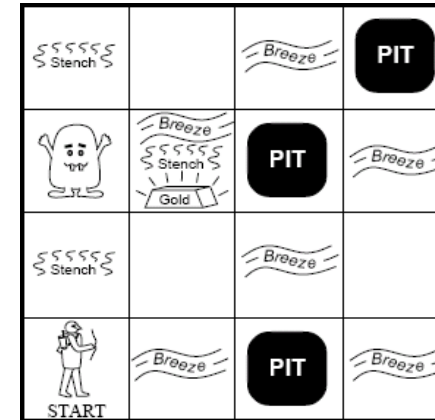
- Blocks world model  
Introduced by Terry Winograd
- World is modeled as a set of abstract symbols which may be reasoned about using *logic*





# Flashback: Logical Reasoning

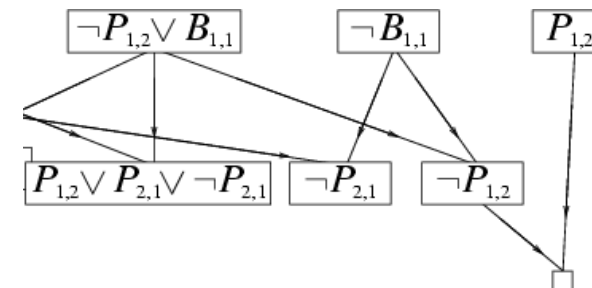
- **Propositional logic** Models and Entailment Inference techniques:
  - Soundness, completeness
  - Resolution
  - Forward/backward chaining
  - WalkSAT



- **First-Order Logic**

Variables, Quantifiers Inference techniques:

- Skolemization & Unification
- Forward/backward chaining
- Resolution

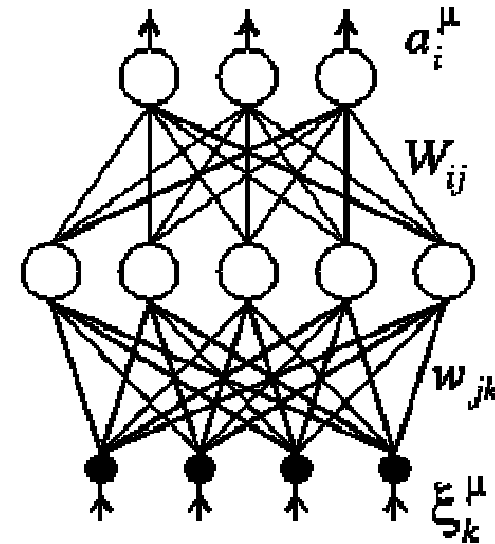




# 1980s: Neural Networks

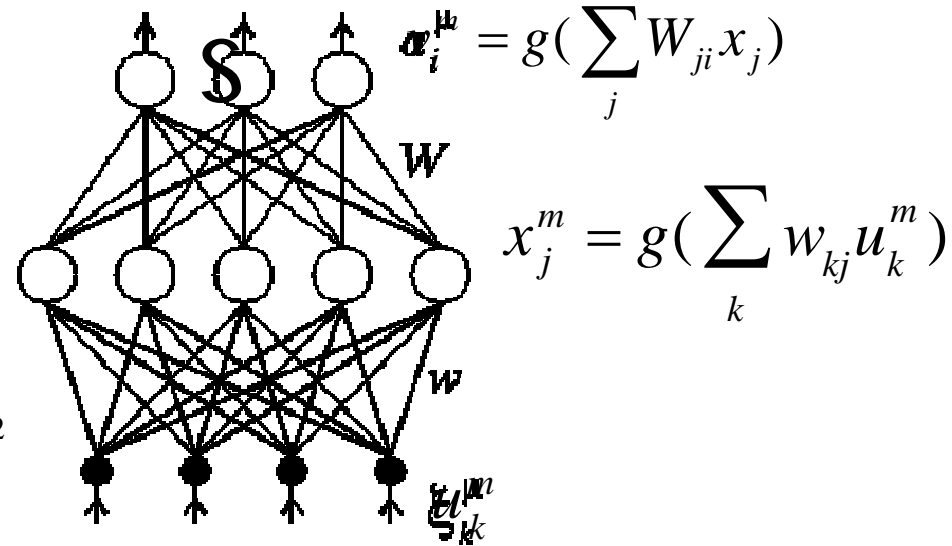
- **Early neural networks**  
McCulloch & Pitts (1943) – simple neural nets  
Rosenblatt (1962) – perceptron
- **Backpropagation learning algorithm**

Invented in 1969 and again in 1974  
Hardware too slow, until rediscovered in 1985





# Flashback: Neural Network



$$E(\mathbf{W}, \mathbf{w}) = \frac{1}{2} \sum_i (d_i - v_i)^2$$

Backprop rule for input-hidden weights w:

$$w_{kj} \rightarrow w_{kj} - \epsilon \frac{dE}{dw_{kj}}$$

$$\frac{dE}{dw_{kj}} = \sum_{m,i} (d_i^m - v_i^m) g'\left(\sum_j W_{ji} x_j^m\right) W_{ji} g'\left(\sum_k w_{kj} u_k^m\right) u_k^m$$

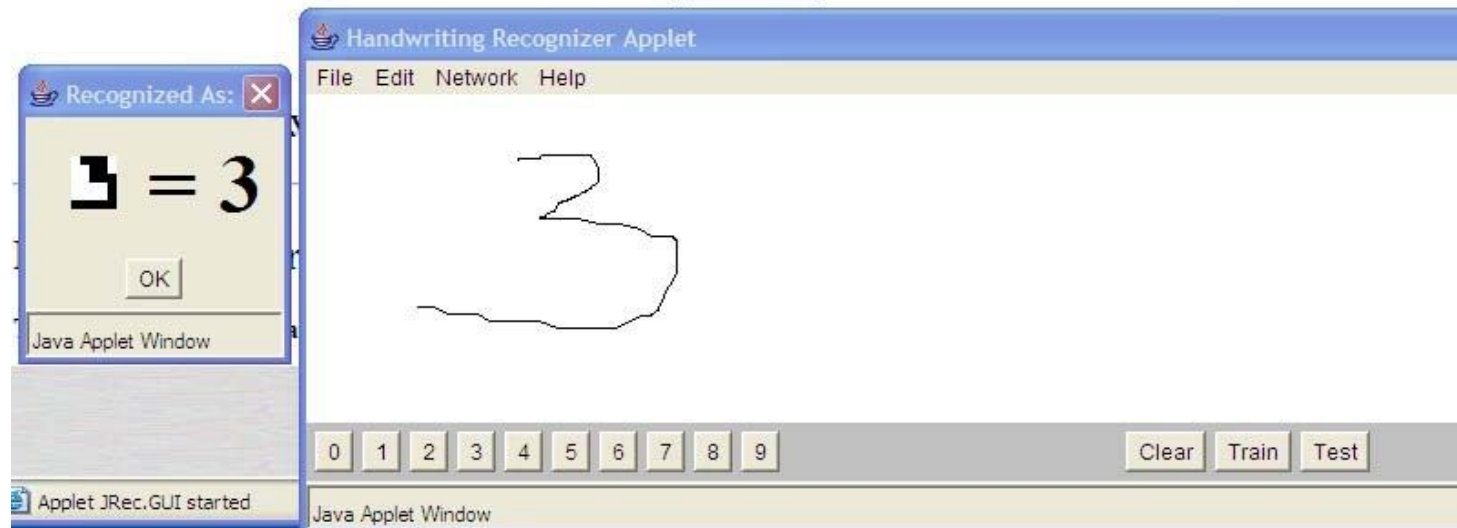


# Application: Handwriting Recognition

## Artificial Neural Network Handwriting Recognizer

Written in Java™

by *Bob Mitchell*



- Demo

- <http://www.cs.rochester.edu/~kautz/Courses/290Bspring2008/NeuralNets/NeuralNetsHandwriting/JRec.html>



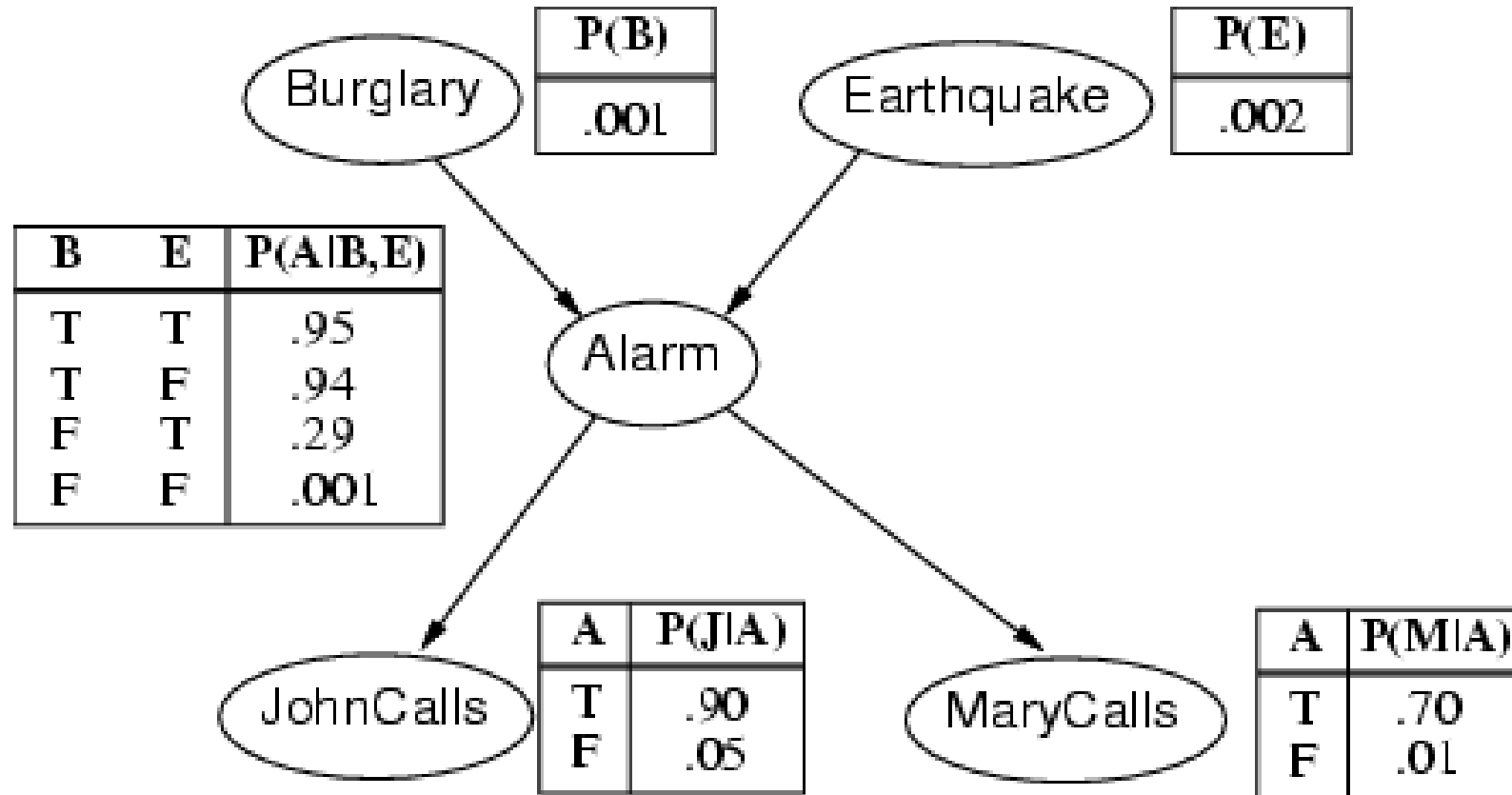


# 1990s to present: Probabilistic Models and Machine Learning

- Probabilistic graphical models
- Pearl (1988) – Bayesian networks
- Machine learning
- Quinlan (1993) – decision trees (C4.5)
- Vapnik (1992) – Support vector machines (SVMs) Schapire (1996) – Boosting
- Neal (1996) – Gaussian processes
- Recent progress:
- Probabilistic relational models, deep networks, active learning, structured prediction, etc.



# Flashback: Bayesian Networks





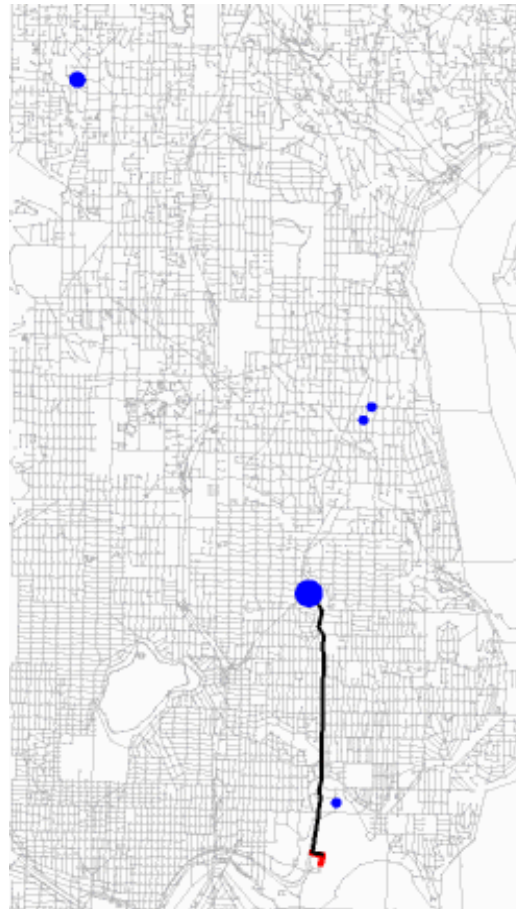
# Application: Tracking a Person using GPS



Tracking



Goal Prediction



Anomaly Detection

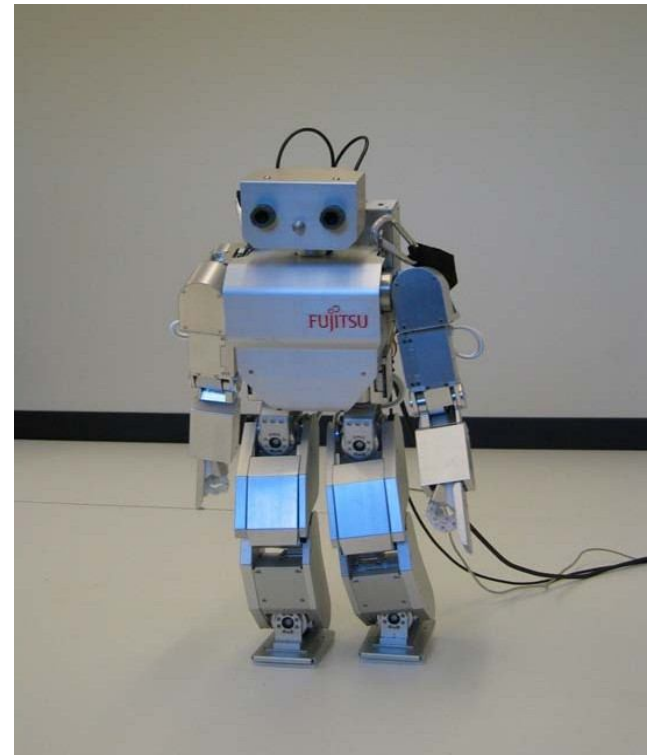
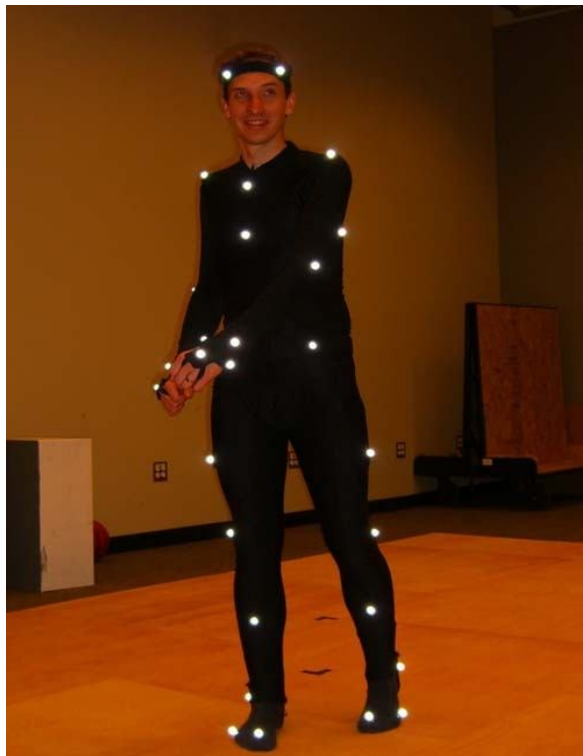


foot=blue, bus=green, car=red

(Work of Prof. Fox, Prof. Kautz, and students)



# Application: Robot Learning by Imitation

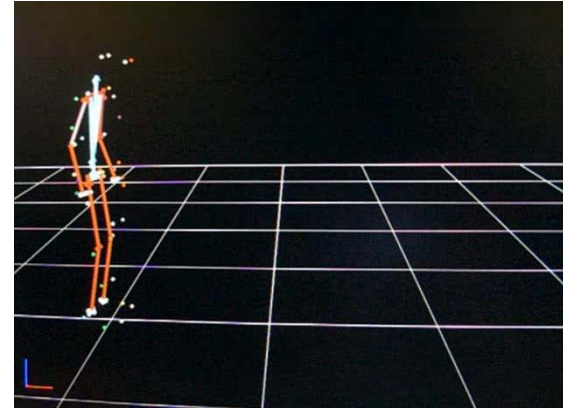




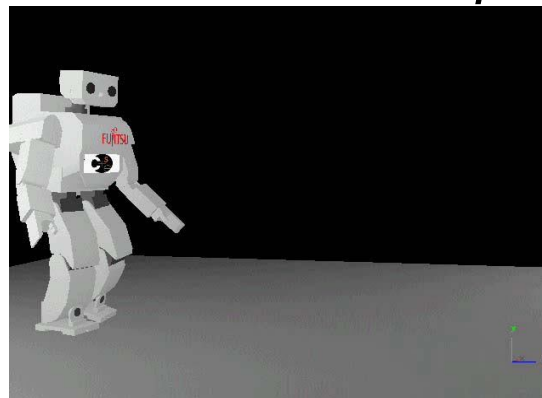
# Imitating from Motion Capture Data



*Motion Capture*



*Data from Motion Capture*



*Attempted Imitation*



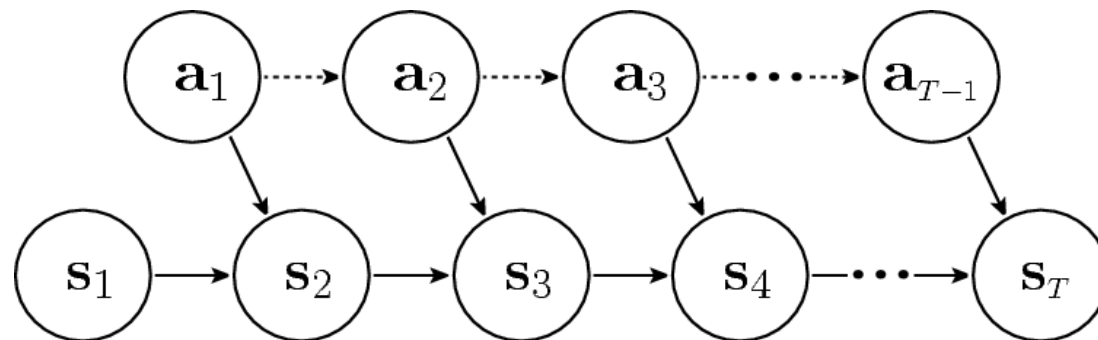
# Bayesian Network for Stable Imitation and Learning



*Idea:* Use Bayesian network to capture consequences of actions (current body state, action)  $\rightarrow$  Next body state

**State  $s$**  = [joint angles, gyro values, foot pressure values]

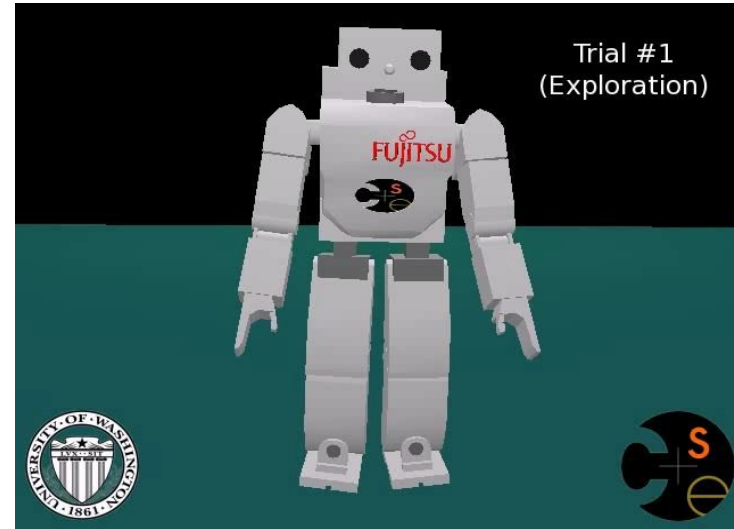
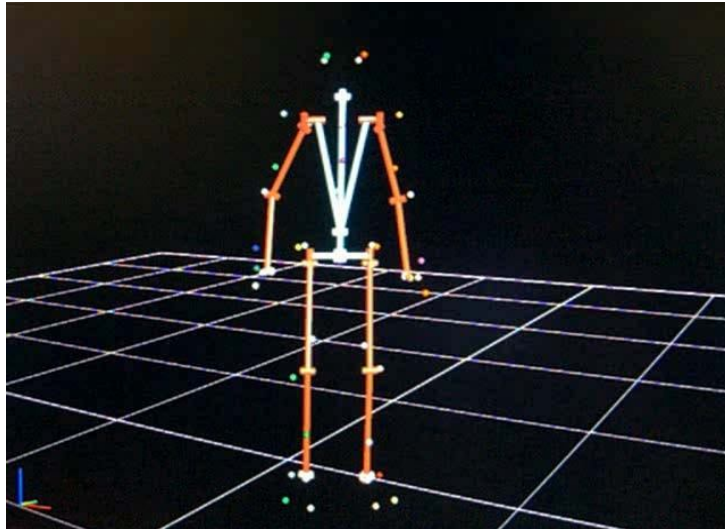
**Action  $a$**  = [position commands to motors for each joint]



**Infer actions  $a_t$  given evidence  $s_1, \dots, s_T$  from teacher  
subject to stability constraints on gyro readings**



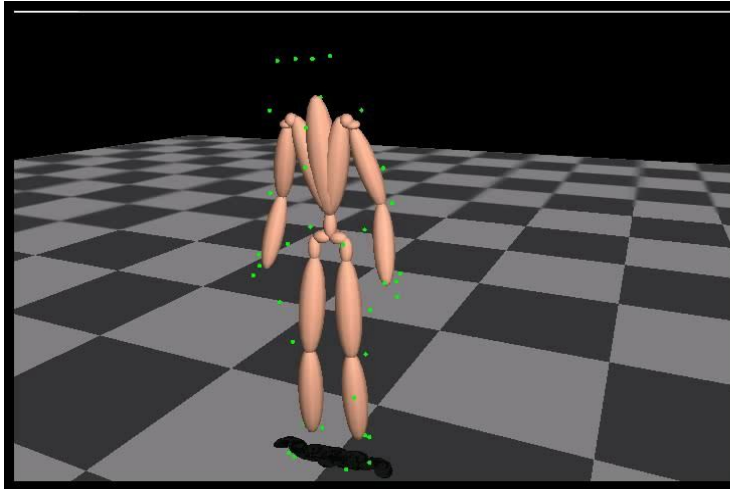
# Learning to Imitate a Human Action



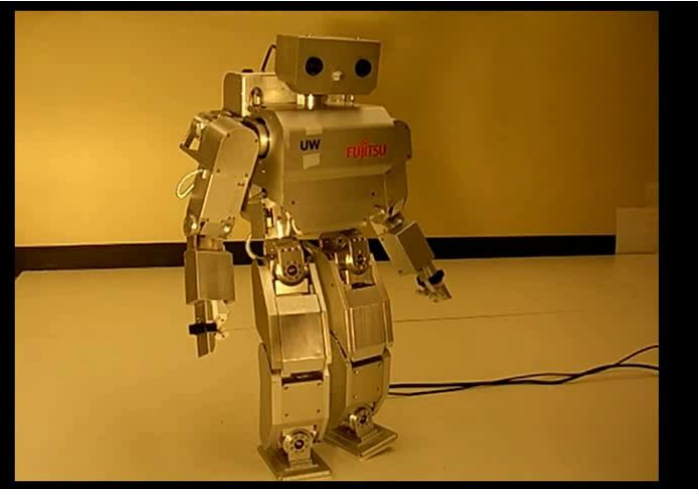




# Result after Learning



*Human Action*



*Imitation*





# The Future of AI

Massive amounts of data  
+  
Sophisticated probabilistic reasoning  
and machine learning algorithms  
+  
Massive computing power  
  
= AI revolution?



# Automated Driving



Winners of the 2005 and 2007 DARPA Grand Challenges

Driverless pod cars at Heathrow International Airport





# AI in a Sensor-rich World



- Intelligent houses
- Intelligent refrigerators
- Intelligent forests
- Intelligent oceans
- Intelligent bridges
- Etc.



# AI in Industry

- **Joseph Sirosh's talk:**

Fraud detection, trust, and safety Just-in-time inventory systems Collaborative filtering

Recommendation in social networks Behavioral ad targeting

- **Other applications**

Stock market prediction

Insider trading and market abuse detection AI-assisted design

Intelligent robots for manufacturing and testing



# Other future AI applications



- **Smart power grids:** electric power flows both ways and is distributed dynamically according to changing demand
- **Security and military:** Bomb diffusing robots, unmanned vehicles, "soldier" robots
- Robot firefighters
- AI Travel Agents
- AI Accountants
- AI Cashiers
- AI Football Coaches
- AI Football Players
- ...

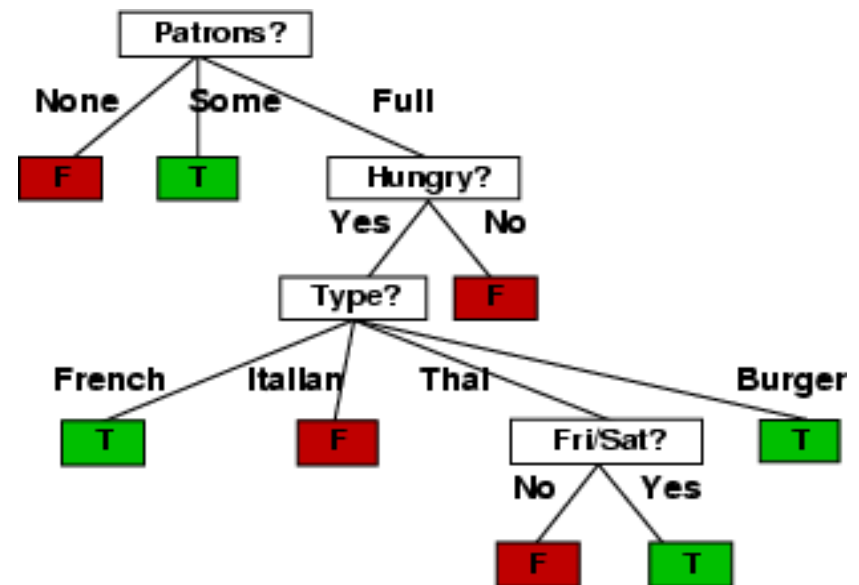
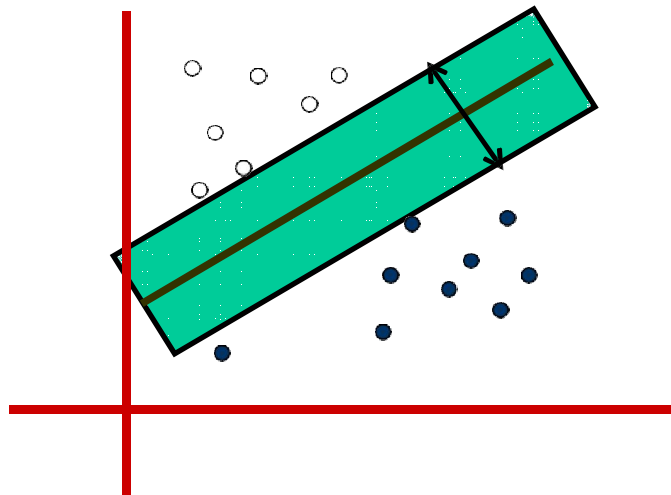


# Flashback: Machine Learning



## Classification

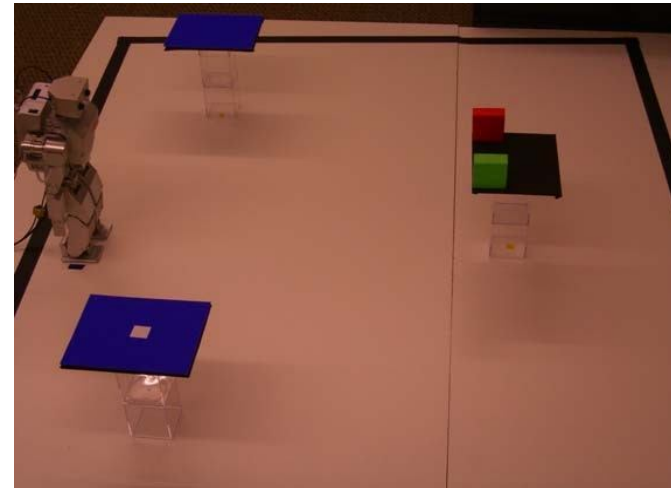
- Decision Trees
- Neural Networks
- SVMs





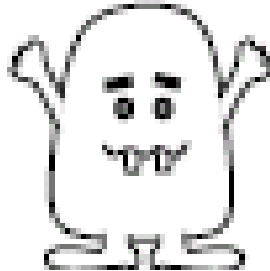
# Application: Brain-Computer Interfaces

- Classifying brain signals recorded at the scalp
- Detect what a person wants from a set of options
- Command a humanoid robot to fetch an object
- Details in Dr. Scherer's talk



[CBS News Sunday Morning](#)





Thank you for  
your  
attention!

