#### **CSE 473**

# Final Lecture: A Smörgåsbord of AI Applications



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### AI in the today's news!

#### The New Hork Times

Tuesday, December 5, 2006 Last Update: 10:11 PM ET

#### Once Again, Machine Beats Human Champion at Chess

A six-game chess match between Vladimir Kramnik of Russia, the world

By DYLAN LOEB McCLAIN Published: December 5, 2006

In the continuing quest to see if humans can outpace their electronic creations, the humans have lost another, perhaps decisive, round.



champion, and Deep Fritz, a souped-up version of commercially available chess

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version of commercially available chess software made by Chessbase, ended today in victory for the computer, which won the final game and clinched the match, 4 games to 2.

### Deep Fritz: Details

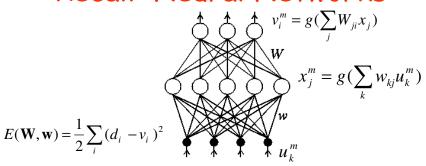
- Based on commercially available Deep Fritz 10 software from Chessbase (selling at \$137.47)
- No specialized chess hardware as in IBM's Deep Blue
- Multi-threaded
- Different search techniques

Null-move heuristic added to  $\alpha$ - $\beta$  pruning: Skip a turn and do a shallow search



Vladimir Kramnik 2760 ½ 0 ½ ½ ½ 0 2.0 Deep Fritz 10

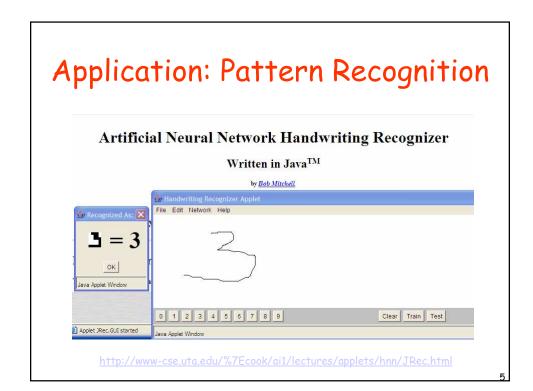
#### Recall: Neural Networks



Backprop rule for input-hidden weights w:

$$w_{kj} \to w_{kj} - \varepsilon \frac{dE}{dw_{kj}}$$

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



#### Recall: Recursive Bayesian Updating

$$P(x \mid z_1,...,z_n) = \frac{P(z_n \mid x, z_1,...,z_{n-1}) P(x \mid z_1,...,z_{n-1})}{P(z_n \mid z_1,...,z_{n-1})}$$

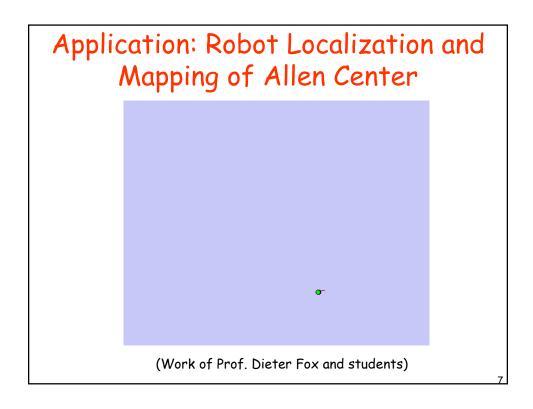
**Markov assumption**:  $z_n$  is independent of  $z_1,...,z_{n-1}$  if we know x.

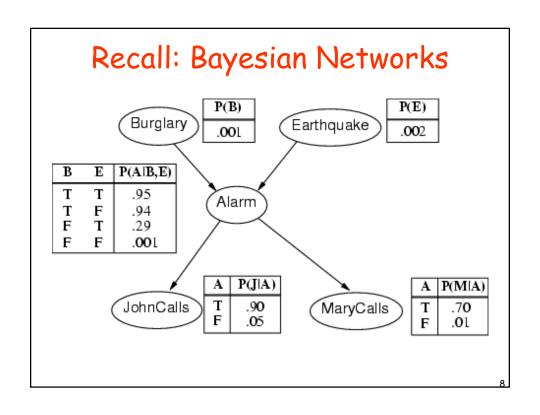
$$P(x \mid z_{1},...,z_{n}) = \frac{P(z_{n} \mid x, z_{1},...,z_{n-1}) P(x \mid z_{1},...,z_{n-1})}{P(z_{n} \mid z_{1},...,z_{n-1})}$$

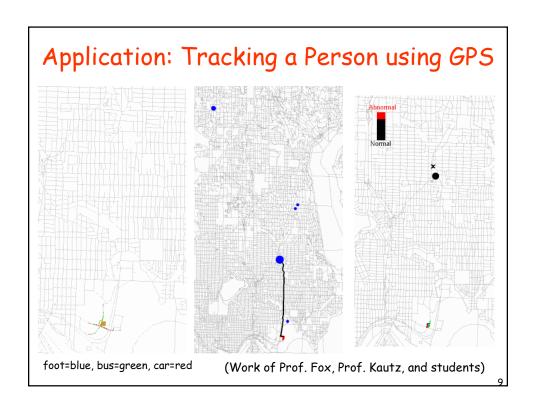
$$= \frac{P(z_{n} \mid x) P(x \mid z_{1},...,z_{n-1})}{P(z_{n} \mid z_{1},...,z_{n-1})}$$

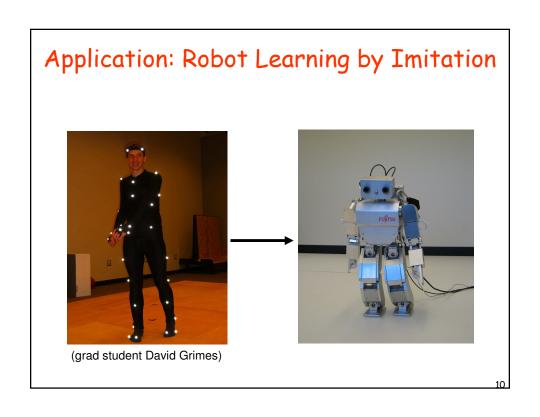
$$= \alpha P(z_{n} \mid x) P(x \mid z_{1},...,z_{n-1})$$

Recursive!





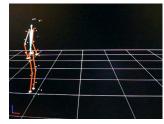




#### Imitating from Motion Capture Data



Motion Capture



Data from Motion Capture



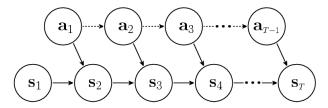
Attempted Imitation

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# Bayesian Network for Stable Imitation and Learning

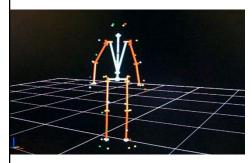
*Idea*: Use Bayesian network to capture consequences of actions (current body state, action)  $\rightarrow$  Next body state

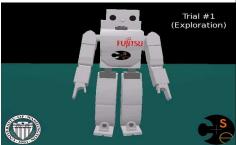
**State s** = [joint angles, gyro values, foot pressure values] **Action a** = [position commands to motors for each joint]



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

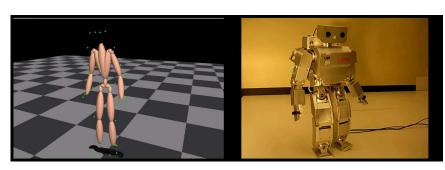
### Learning to Imitate a Human Action





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## Result after Learning

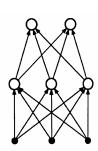


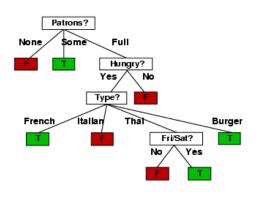
Human Action

**Imitation** 



- Decision Trees
- Nearest Neighbors
- Neural Networks
- Etc.



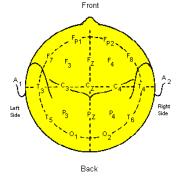


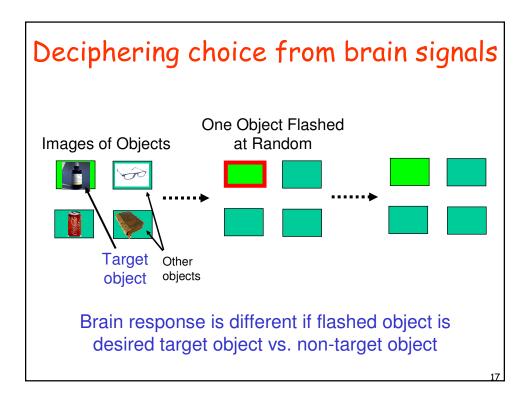
Application: Brain-Computer Interfaces

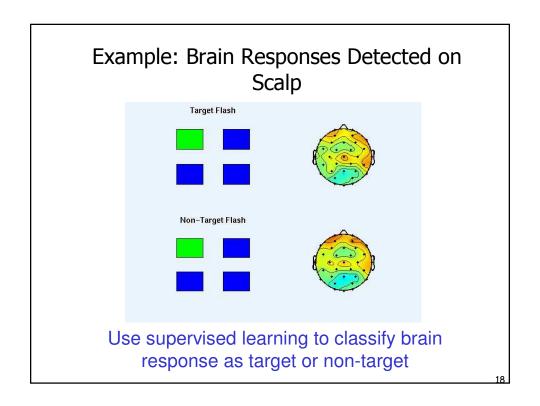
- Classifying brain signals recorded at the scalp
- Detect which object a person wants from a set of objects

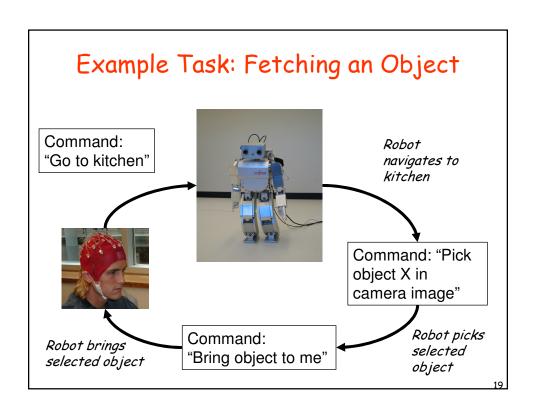


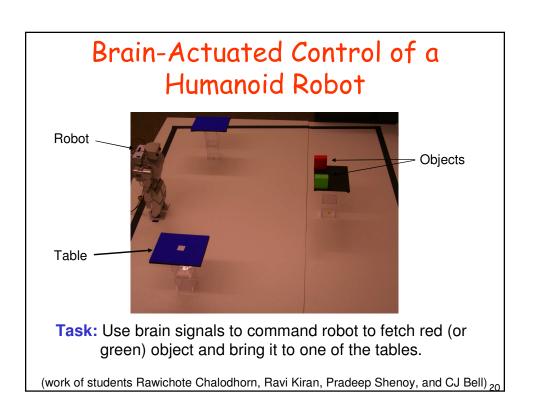
(grad student Pradeep Shenoy)



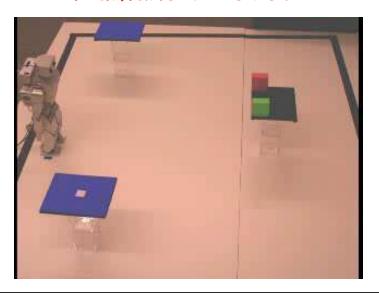








## Brain-Actuated Control of a Humanoid Robot



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#### Take-Home Final: Details

- · Will be posted on website later today
- 5 problems, open book, open notes
- Focus mostly on post-midterm material
- Due Wednesday Dec 13 by midnight via email to Raj and Abhay
- Will involve a mix of problem solving and descriptive questions

E.g., Computing probabilities in Bayesian networks, explaining important concepts in AI (A\* search, alpha-beta pruning, etc.)

