# CS 730/730W/830: Intro AI

■ Break

HMMs

1 handout: slides final blog entries were due

### **Break**



- Wed May 2: HMMs, unsupervised learning, applications
- Mon May 7: special guest Scott Kiesel on robot planning
- Wed May 9, 9-noon: project presentations
- Thur May 10, 8am: paper drafts (optional for some)
- Fri May 11, 10:30: exam 3 (N133)
- $\blacksquare$  Tues May 15, 3pm: papers (one hardcopy + electronic PDF)

menu?

■ Break

### HMMs

- Models
- The Model
- Viterbi Decoding
- Random
- **■** EOLQs

# **Hidden Markov Models**

## **Probabilistic Models**

■ Break

HMMs

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**■** EOLQs

MDPs:

**Naive Bayes:** 

k-Means:

Markov chain:

**Hidden Markov model:** 

### A Hidden Markov Model

■ Break

#### **HMMs**

■ Models

### ■ The Model

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- **■** EOLQs

$$P(x_t = j) = \sum_{i} P(x_{t-1} = i) P(x_t = j | x_{t-1} = i)$$
  
 $P(e_t = k) = \sum_{i} P(x_t = i) P(e = k | x = i)$ 

More concisely:

$$P(x_t) = \sum_{x_{t-1}} P(x_{t-1})P(x_t|x_{t-1})$$

$$P(e_t) = \sum_{x_t} P(x_t)P(e|x)$$

# **Viterbi Decoding**

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```
given: transition model T(s,s') sensing model S(s,o) observations o_1,\ldots,o_T find: most probable s_1,\ldots,s_T
```

```
\begin{array}{l} \text{initialize } S \times T \text{ matrix } v \text{ with 0s} \\ v_{0,0} \leftarrow 1 \\ \text{for each time } t = 0 \text{ to } T - 1 \\ \text{ for each state } s \\ \text{ for each new state } s' \\ \text{ score } \leftarrow v_{s,t} \cdot T(s,s') \cdot S(s',o_t) \\ \text{ if score } > v_{s',t+1} \\ v_{s',t+1} \leftarrow \text{ score} \\ \text{ best-parent}(s') \leftarrow s \\ \text{trace back from } s \text{ with max } v_{s,T} \end{array}
```

## Random

■ Break

**HMMs** 

■ Models

■ The Model

■ Viterbi Decoding

Random

■ EOLQs

applications

unsupervised learning: dimensionality reduction

# **EOLQ**s

- Break
- **HMMs**
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- EOLQs

- What question didn't you get to ask today?
- What's still confusing?
- What would you like to hear more about?

Please write down your most pressing question about AI and put it in the box on your way out.

Thanks!