## Artificial Intelligence

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| 0 | $X$ | $X$ |
| 0 |  | $X$ |








## Watch History



Watch History


Recommended



Recommended


## Artificial Intelligence

## Decision-Making



## Decision Trees


while game is ongoing: if ball left of paddle: move paddle left else if ball right of paddle: move paddle right else:
don't move paddle



## Optimal Decision-Making



E

X wants to maximize score.
O wants to minimize score.



Score? Turn: X


## Minimax

if player is X :
for all possible moves:
calculate score for board choose move with highest score
else:
for all possible moves:
calculate score for board
choose move with lowest score

## Machine Learning

## Reinforcement Learning










## Explore vs. Exploit

## Explore vs. Exploit Strategy

$$
\text { epsilon = } 0.10
$$

if random() < epsilon: make a random move
else:
make the move with the highest value

## Genetic Algorithms

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## Genetic Algorithm

make initial generation of candidates randomly repeat until successful:
for each candidate: calculate candidate's fitness
remove least fit candidates make new generation from remaining candidates



Recommended


## Classification

Nearest-Neighbor Classification

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k-Nearest-Neighbor Classification

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$[1,2,5,2,3,1,2,8,1,3]$




## Artificial Intelligence

