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# 6.189 IAP 2007

#### **Student Project Presentation**

### **Backgammon Tutor**

# Backgammon Tutor

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## Goals

- Implement the rules of backgammon
  - Create/Find a function that evaluates how "good" a board is
- Parallelize the evaluation of future board states in order to determine help determine what the best move is this turn
- Teach the player by suggesting a better move and explaining why it is a better move

## **Board Evaluation**

#### Static Evaluator

- Linear sum of weighted board features
- 1979 BKG 9.8 (Hans Berliner CMU) beat ruling world champion
  - Adjusted weights as game progressed

#### Neural Nets

- Traditionally most successful
- Trained over 100,000+ games
- Pubeval Gerry Tesauro, IBM Research 1993
  - Released as benchmark evaluator that produces play at the intermediate level

## Search

- Look at future turns in order to choose best move now
- Large Branching Factor
  - Checkers 10
  - Chess 35-40
  - Backgammon 400
- Uncertainty of future dice rolls (21 possible combinations)
- Pubeval is not zero-sum
- Does searching deeper produce a better play?
  - Most papers say search is less important than a good evaluator
  - Search produces slightly better play Can still make a big difference



# **Parallelizing Board Evaluation**

- Millions of leaf nodes that each represent a board state
- Attempt to split evenly between SPUs
- Each has a multiple of 4 boards
- All boards (~170,000 in benchmarks) can't go over to the SPU at once
- SPU knows how much it has to process, takes as much as it can, evaluates, returns, and gets more
- Each should finish at roughly the same time
- SIMDize code to evaluate 4 boards at once
- Double buffer so we can DMA and compute at the same time

### Performance – Evaluating 1 Million Boards



## Speedup – Evaluating 1 Million Boards





# **Development Techniques**

Get sequential code working correctly on single core

- Squash bugs and memory leaks
- Implement parallel code as sequential code to make sure algorithm works
- Convert parallel code to run on 1 SPU
- Get code working on all 6 SPUs
- Most debugging done with printf statements

# Challenges

- We aren't backgammon experts or even intermediate players
- Getting the game to a playable state took a good chunk of our total time
- Managing search tree
- Memory management
- Cell Debugging
- Bit packing the boards so when we are storing millions of them they fit into memory

## Future Work

- Finish move tree traversal after board evaluation
- Move tree pruning (beam search)
- Parallelize move tree creation and traversal
- SIMDize and buffer board evaluation
- Training Board Evaluators
- Monte Carlo approach to finding the best move
- Explaining in English why one move is better than another