

# Evolution of an Efficient Search Algorithm for the Mate-In-N Problem in Chess

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2007 "HUMIES" AWARDS FOR HUMAN-COMPETITIVE RESULTS

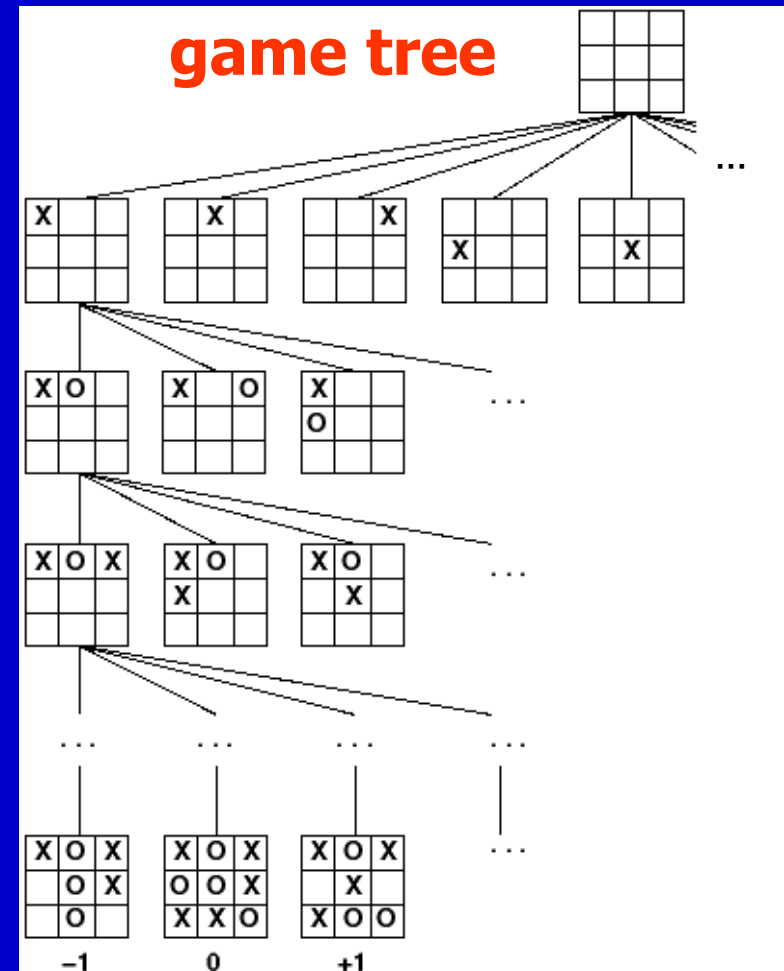


Monday, July 9, 2007



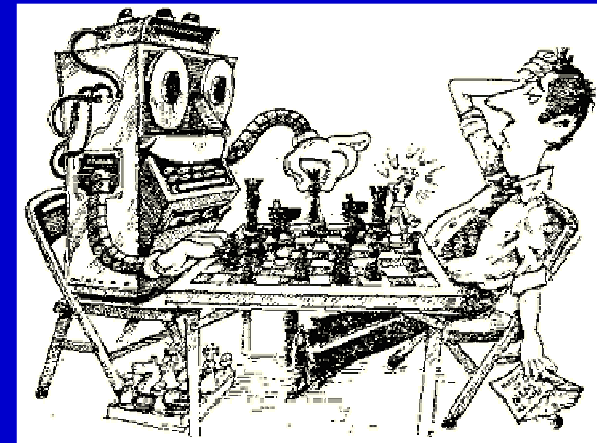
# Game-Playing AI

- **Game Strategy =**  
**Search + Knowledge**
- **Search:**  
Number of nodes developed
- **Knowledge:**  
Evaluation of nodes
- **Tradeoff between the two**



# Chess: Machine Players

- **Powerful contemporary engines**
  - Crafty, Fritz, Deep Junior, ...
  - Lots of search
  - Less knowledge
- **Intelligent? Hmmm...**
  - Very little generalization
  - Gobbles computational power
  - Deemed theoretically uninteresting [Chomsky, 93]



# Chess: Human Players

- Use problem solving cognition
- Deeply knowledge-based play
- Massive use of pattern recognition; parallelism
- Also use search but
  - Substantially less nodes (typically dozens)
  - Selective (only "good")
  - More efficient: less nodes for "same" result
- Good source of inspiration for algorithms



# Our Goal



- Concentrating on endgames we previously:
  - evolved node-evaluation function (knowledge) with GP
  - Results: draw or win against CRAFTY, a world-class chess engine
  - Part of work that won a 2005 humies medal
- This work: Evolve the search algorithm itself
- Evolve both search and knowledge, letting evolution balance the two

# Incentive for Current Work



- Previously evolved players:
  - Sometimes miss (easy) shallow mates
  - Scaling problem: adding pieces to board decreased scores
- Evolved players should rely more on search
  - Full pure-knowledge player still unattainable
  - Search makes the strongest engines
- Problem:
  - Simply adding search: too slow (each node thoroughly examined)
- SOLUTION:
  - Balancing search & knowledge through evolution

# Problem Domain

- **Mate-in-N: Is there a forced win sequence in maximum  $2*(N-1)$  plies ?**
- **Crucial to chess engines, searched far more thoroughly**
- **CRAFTY: For difficult N=5 cases searches over  $10^6$  nodes**

|                 |     |    |     |      |      |
|-----------------|-----|----|-----|------|------|
| Mate-in         | 1   | 2  | 3   | 4    | 5    |
| Depth in plies  | 2   | 4  | 6   | 8    | 10   |
| Nodes developed | 600 | 7K | 50K | 138K | 1.6M |

# Major Result

Evolved search algorithm:

Number of nodes developed reduced by 47%

with respect to world-class engine (not simple  $\alpha\beta$ )

| Mate-in | 1   | 2  | 3   | 4    | 5    |
|---------|-----|----|-----|------|------|
| CRAFTY  | 600 | 7K | 50K | 138K | 1.6M |
| Evolved | 600 | 2k | 28k | 55K  | 850k |



# Result is Human-Competitive

- (H) result holds its own or wins a regulated competition involving human-written computer programs
- (B) better than result accepted as a new scientific result at the time
- (D) result is publishable in its own right
- (F) better than result considered an achievement at the time
- (G) result solves a problem of indisputable difficulty in its field

# Why is Result Best?



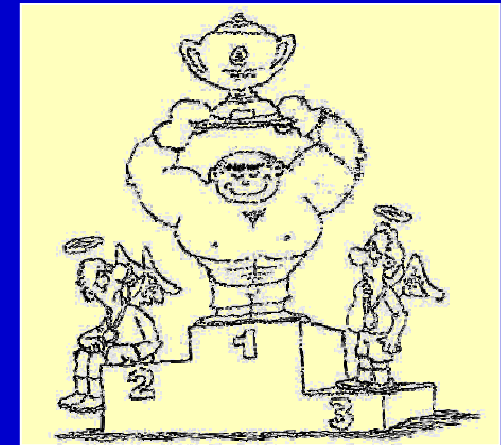
- Difficult for most human chess players:
  - Must train intensively not to miss (and lose game)
- Our evolved strategies improve upon one of top chess engines in existence (Crafty), representing many human years of programming
- We're beating this top-notch engine in its own "territory": massive search
- Problem is crucial to chess engines, therefore much computational power is expended (e.g., in such positions, Deep Blue examines twice the normal number of nodes)

# Why is Result Best? (cont'd)

- Evolving a dynamic algorithm (i.e., a process) usually harder than evolving a static structure
- We took evolution to the next level: balancing search and knowledge
- Surpasses previous EC solutions



In a nutshell:



1. Hard problem in hard domain for man & machine (chess)
2. Evolved algorithm better than (most) humans
3. Evolved algorithm better than human-written top engine
4. Evolution taken to next level

- **A. Hauptman and M. Sipper**

Evolution of an efficient search algorithm for the mate-in-n problem in chess

**Proceedings EuroGP2007, pp. 78-89,  
April 2007**

- **M. Sipper, Y. Azaria, A. Hauptman,  
& Y. Shichel**

Designing an evolutionary strategizing machine for game playing and beyond

**IEEE Transactions on Systems, Man,  
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