



# Checkers Solved

Schaeffer et al. 2007

Artificial Intelligence for Games

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# Overview

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# History

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- 1950 start with Arthur Samuel's pioneering work in machine learning
- 1963 first win of a checker program
- 1989 start of the search for a champion challenging program
- 1992 peak, over 200 processors were devoted simultaneously
- 1994 defeat of a world champion (Chinook), but not solved yet



# Definition Of Solving

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## 3 States of Solving:

1. **ultra weakly:** Outcome known for starting position
2. **weakly:** Outcome and Strategy known for the starting position
3. **strong:** Outcome and Strategy known for the every position

# Checkers

## Rules:

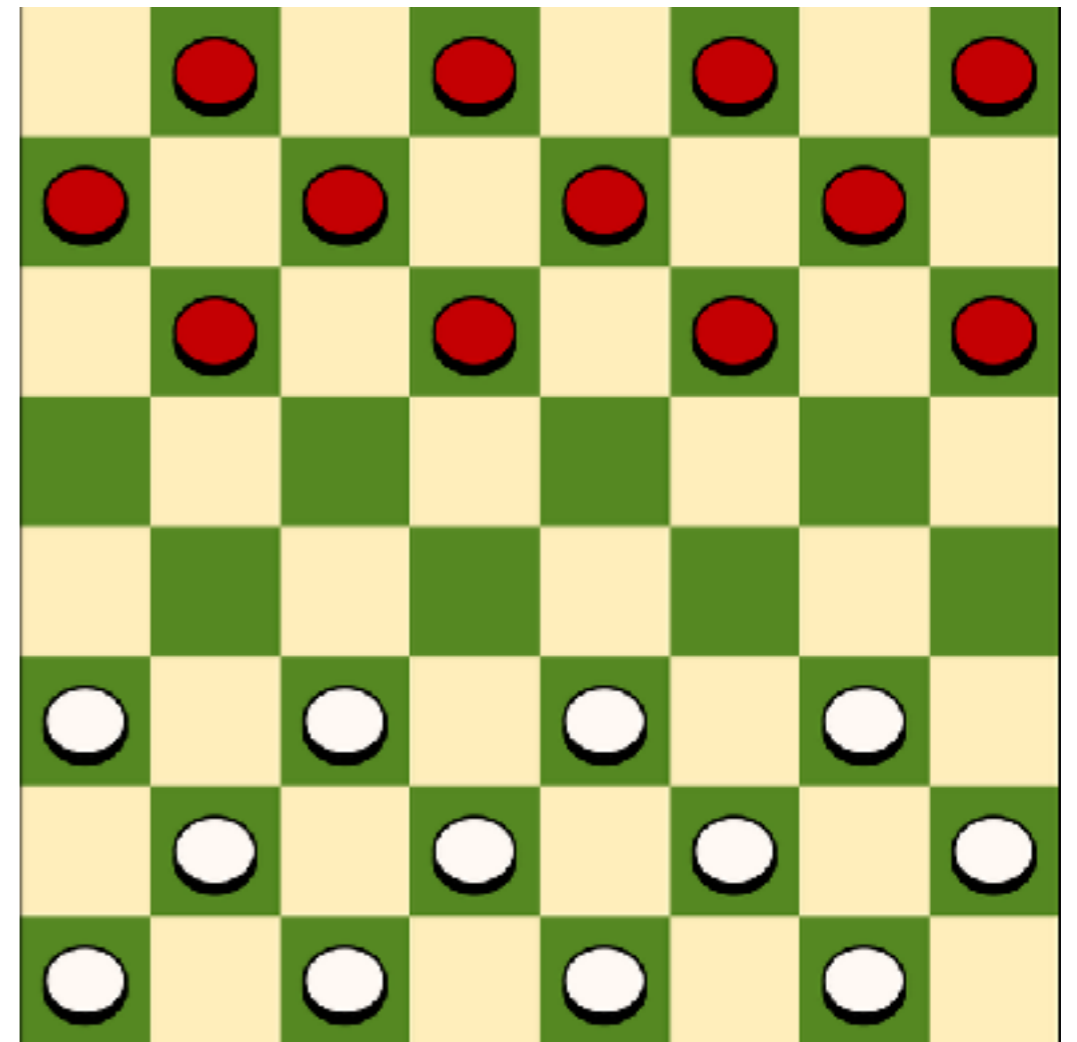
- Kings can move one field, but backwards, too
- 8x8 field, but only on black played

- 2 types of figures

=>  $5 \cdot (10^{20})$  positions

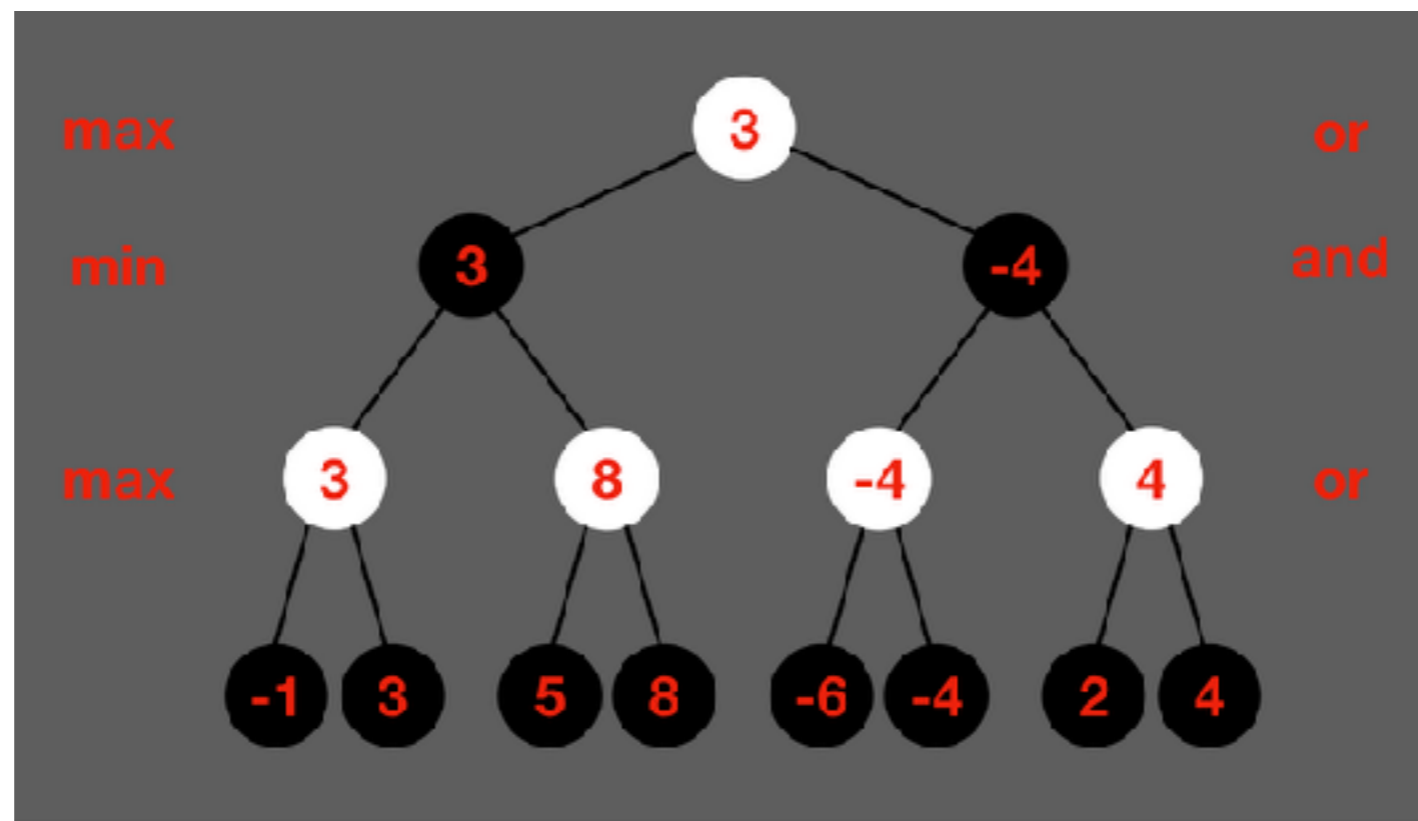
## Restriction:

- Forced-Capture



# Solving Methods

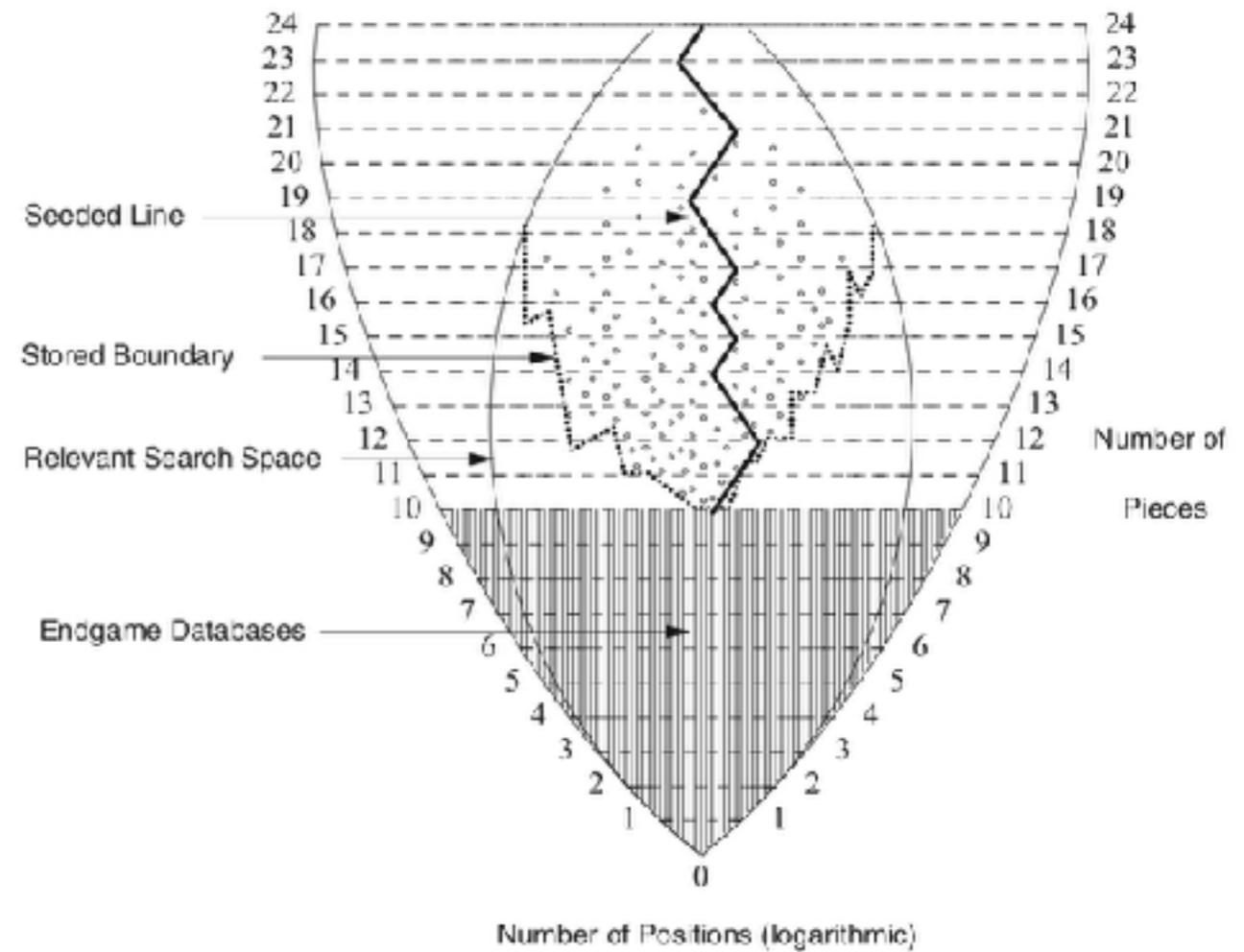
Perfect play from both players



# Solving Methods

## 3 Components:

1. Database
2. Proof-tree manager
3. Proof-tree solver
  1. Alpha-Beta
  2. Depth first proof number (Df-Pn)



# Database

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- 1989-1996 8 piece
- In 2001 only 1 month for 8 piece
- 2001-2005 10 pieces

Pieces	Number of positions
1	120
2	6,972
3	261,224
4	7,092,774
5	148,688,232
6	2,503,611,964
7	34,779,531,480
8	406,309,208,481
9	4,048,627,642,976
10	34,778,882,769,216
Total 1–10	39,271,258,813,439

For 1 piece:  $(32+28)*2=120$

forced-capture => fast reduction to 10  
=> much smaller game tree



# Proof-tree manager

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Maintains a tree of the proof in progress  
Identifies positions which are interested

1. Several hundred at a time

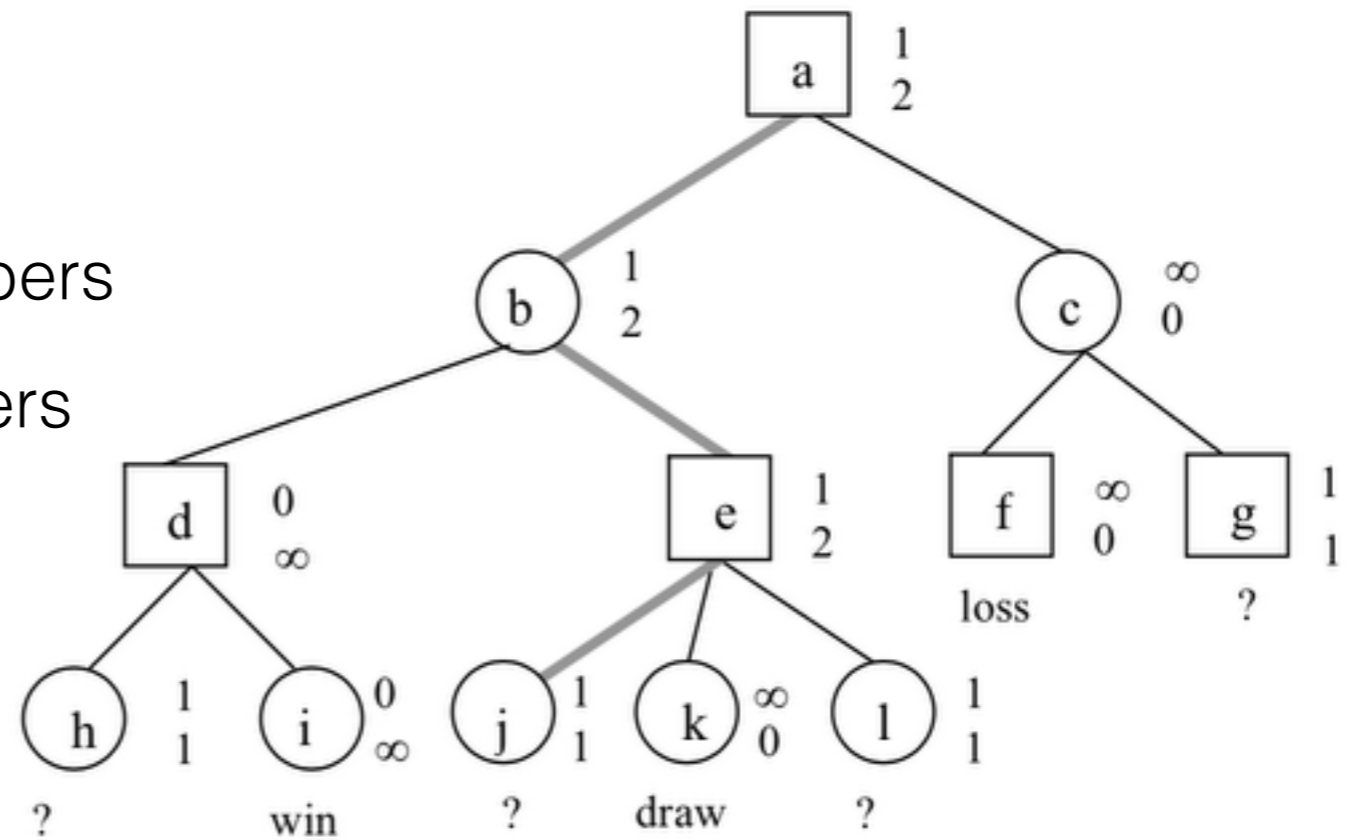
## Proof number Search

1. Disprove value := minimum number of leaf nodes needed for disproof
2. Prove value := minimum number of leaf nodes needed for the proof

# Proof number

## Rules

1. Or: sum up child disproof numbers
2. And: sum up child proof numbers

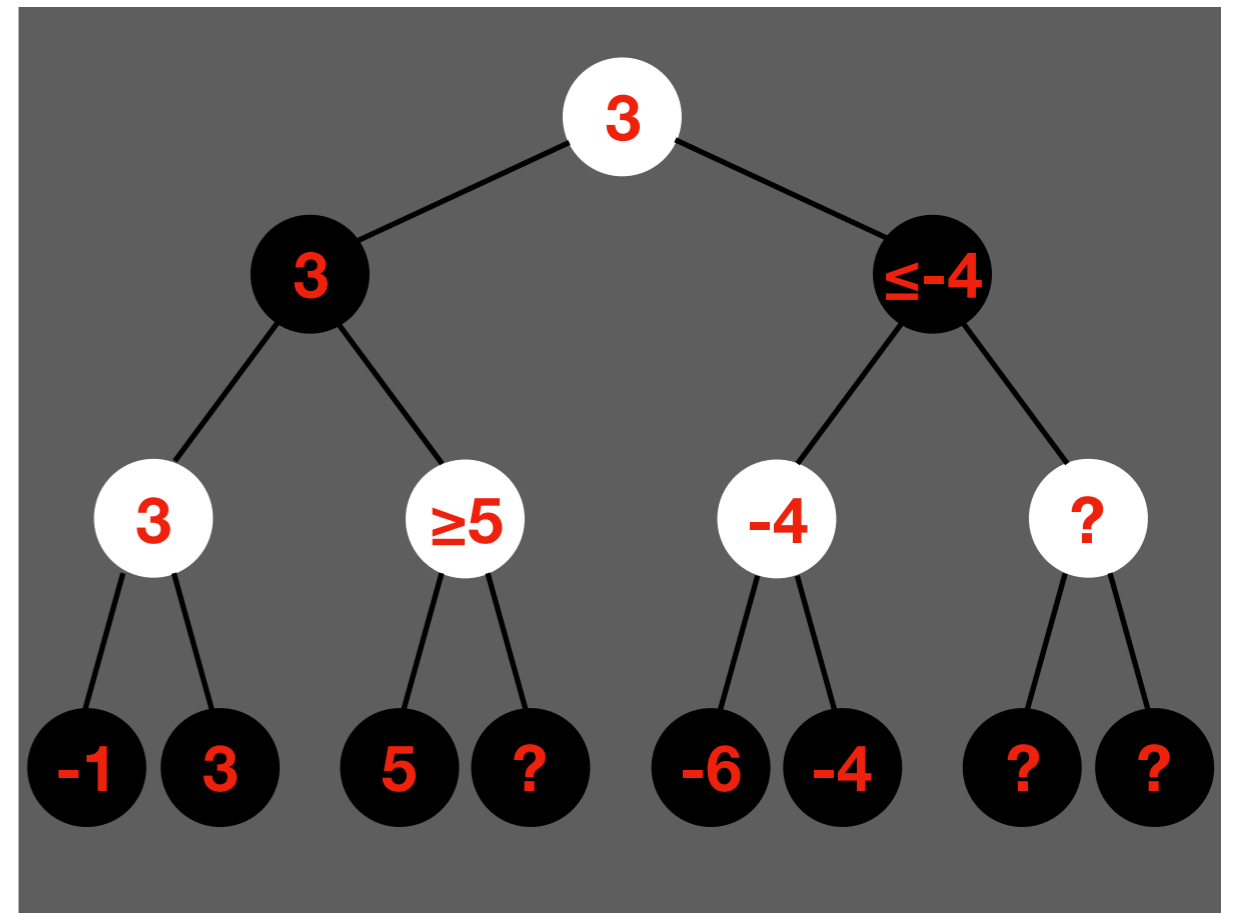


# Alpha-Beta-Pruning

## Thresholds for pruning trees

1. Alpha := lower threshold
2. Beta := upper threshold
3. initialized with +/- „infinity“

$$b^d \Rightarrow b^{(d/2)}$$



## Depth-First Proofing Number

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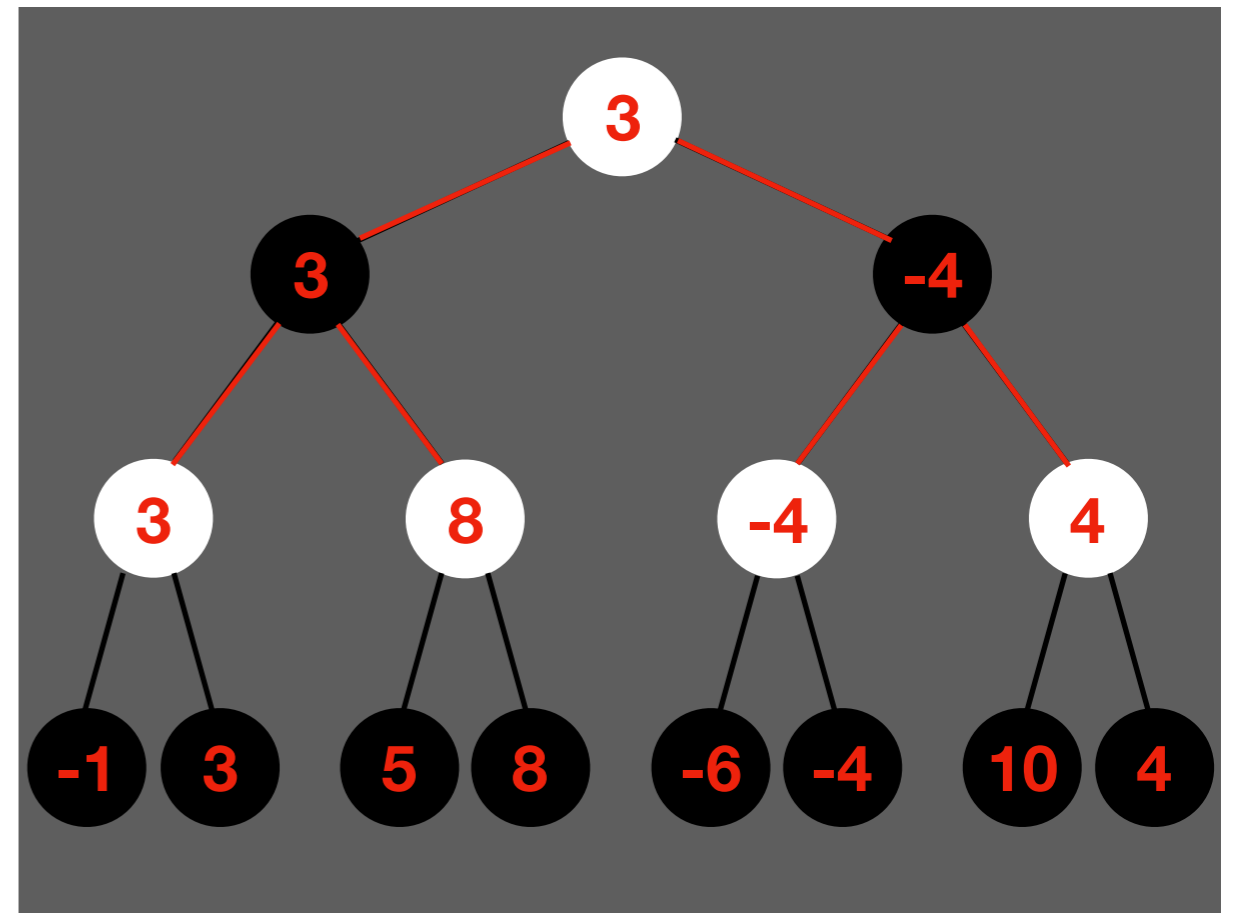
- Similar to Alpha-Beta
- Creates threshold for disproof/proof number
- follows best children until a proof is found

=> if no proof is found a heuristics value is calculated (Chinook)

# Iteration

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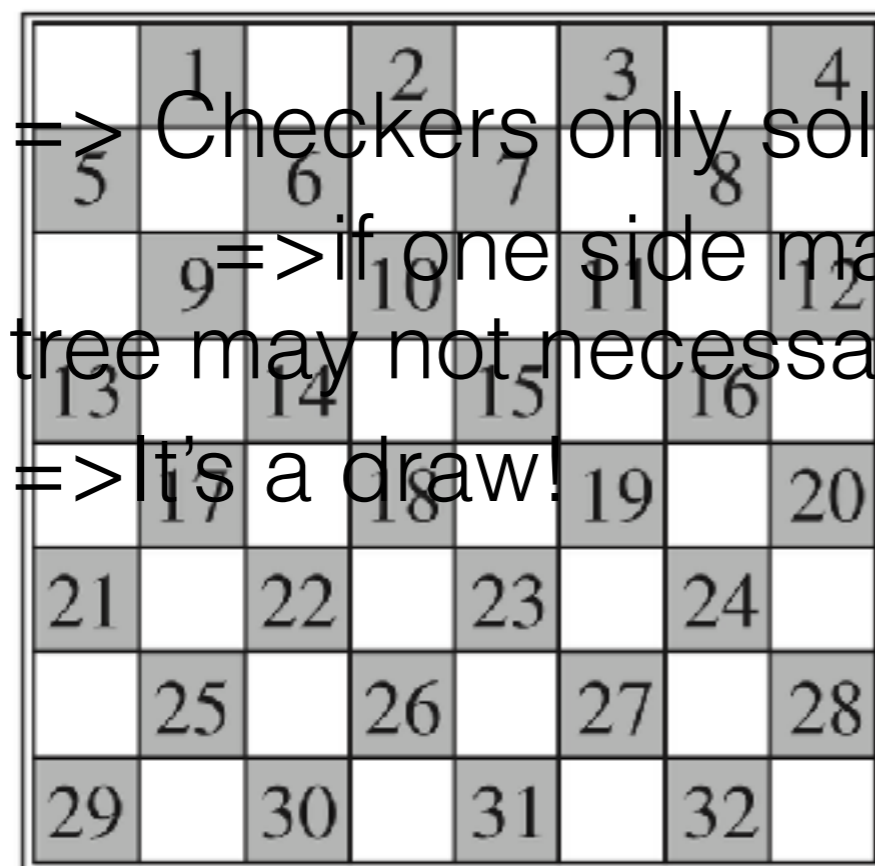
- Most iterate on search depth
- Manager uses threshold  $t$ :
  - scores  $\leq -t$  are losses
  - scores  $\geq t$  are wins
  - increase  $t$



# Results

Only 19 starting positions have to be considered:

1. 300 three-move openings, more than 100 are duplicates
2. rest can be proven to be irrelevant by an alpha-beta search



=> Checkers only solved weakly!  
 => if one side makes a losing mistake, the proof tree may not necessarily show how to win.  
 => It's a draw!

No.	Opening	Proof	Searches	Max ply
1	09-13 22-17 13-22	Draw	736,984	56
2	09-13 21-17 05-09	Draw	1,987,856	154
3	09-13 22-18 10-15	Draw	715,280	103
4	09-13 23-18 05-09	Draw	671,948	119
5	09-13 23-18 11-16	Draw	564,193	85
6	09-13 24-19 11-15	Draw	854,205	53
7	09-13 24-20 11-15	Draw	1,058,328	59
8	09-14 23-18 14-23	≤Draw	2,202,533	77
9	10-14 23-18 14-23	≤Draw	1,296,790	58
10	10-15 22-18 15-22	≤Draw	543,603	60
11	11-15 22-18 15-22	≤Draw	919,594	67
12	11-16 23-19 16-23	≤Draw	1,969,641	69
13	12-16 24-19 09-13	Loss	205,385	44
14	12-16 24-19 09-14	≤Draw	61,279	45
15	12-16 24-19 10-14	≤Draw	21,328	31
16	12-16 24-19 10-15	<Draw	31,473	35
17	12-16 24-19 11-15	≤Draw	23,803	34
18	12-16 24-19 16-20	≤Draw	283,353	49
19	12-16 24-19 08-12	<Draw	266,924	49
Overall		Draw	Total	Max
			15,123,711	154

# Results

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- search effort:  $10^{14}$  (with only alpha beta  $10^{24}$ )
- 10 pieces database is 237 Gb large (154 positions per byte)
- 50 computers simultaneously for search tree for 3 years

# Conclusion

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## Correctness:

- many potential sources of errors (algorithm bugs, data transmission errors)
- computations have been independently verified
- outcome manually checked
- Chance of error propagation is small



## Sources

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- Checkers Is Solved, Schaeffer et al. 2007
- An Analysis of Alpha-Beta, Priming Donald E. Knuth and Ronald W. Moore
- Searching for Solutions in Games and Artificial Intelligence, L. Allis
- Parallel Depth First Proof Number Search, Tomoyuki Kaneko
- Proof-Number Search and its Variants, H. Jaap van den Herik and Mark H.M. Winands