



# Beyond Luck Mathematics and Games

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Milan / November 19th, 2012



## Overview

Classification of Games

Combinatorial Games

Evaluation of Positions

Efficient Evaluation of Positions

Computational Work

Winning Strategies and Decidability

Epilogue

References



## Two Main Aspects

- ▶ Chance
- ▶ Strategy



## Importance of Strategy

- ▶ Low: Throwing dices, Lotteries
- ▶ Medium: Poker, Bridge, Monopoly
- ▶ Crucial: Othello, Nine Men's Morris, Checkers, Chess, Go



## Structure

- ▶ Two players are drawing alternatively.
- ▶ For every possible position there is a finite number of possible draws.
- ▶ There is a finite number of possible final outcomes (Win, Loss, Tie).
- ▶ The gain of one player equals the loss of the other one (zero-sum-game).
- ▶ There is no infinite sequence of positions.
- ▶ Chance is excluded.



## Problems

- ▶ Evaluate a given position.
- ▶ Find an optimal draw.
- ▶ Can winning be enforced?
- ▶ Is the game fair?



## Evaluation of Positions

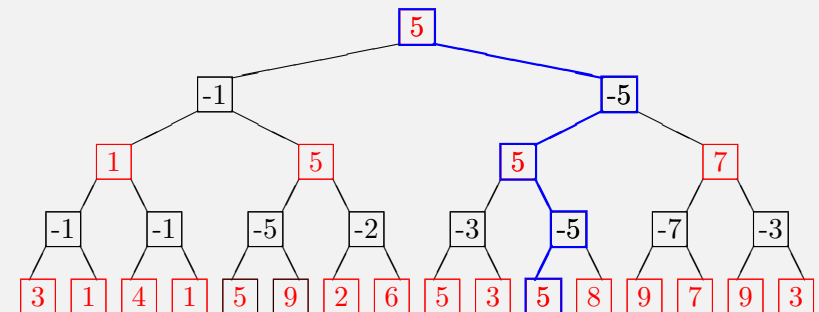
- ▶  $F(p)$  is the value of position  $p$  for the player with the right to draw.
- ▶  $-F(p)$  is the value for the other player.
- ▶ Value of a terminal position:

$$F(p) = \begin{cases} \infty & \text{for a win} \\ -\infty & \text{for a loss} \\ 0 & \text{for a tie} \end{cases}$$

- ▶ Value of a non-terminal position?



## Tree





## Value of a Non-Terminal Position

- ▶ Position  $p$  allows  $d$  possible draws which give rise to positions  $p_1, \dots, p_d$ .
- ▶  $F(p)$  should give the value of  $p$ .
- ▶  $F(p) = \max\{-F(p_1), \dots, -F(p_d)\}$
- ▶ Recursive definition!
- ▶ Neg-max search



## Naive Realisation

- ▶ Search the complete tree and evaluate  $F$  recursively.
- ▶ This is too costly.
- ▶ Use a fixed depth for the search or a time-monitor.
- ▶ This only yields an approximation for  $F$ .



## Naive Programme

```
int value(Position p) {  
    if( endPosition(p) )  
        return F(p);  
    int v = - INF;  
    while( nextChild(p, q) )  
        v = max( v, -value(q) );  
    return v;  
}
```



## Goals

- ▶ Try to decide as early as possible whether a given branch of the tree yields a better result.
- ▶ Try to prune (cut) inefficient branches as close as possible to the root (= current position).
- ▶ Try to achieve an increased search-depth with a shorter computing time.



## $\alpha$ - $\beta$ -pruning (Donald N. Knuth)

- ▶ Construct a function  $G(p, \alpha, \beta)$  such that:

$$G(p, \alpha, \beta) = \begin{cases} \alpha & \text{if } F(p) \leq \alpha, \\ F(p) & \text{if } \alpha \leq F(p) \leq \beta, \\ \beta & \text{if } \beta \leq F(p). \end{cases}$$

- ▶ At the root:  $G(p, -\infty, \infty)$



## Realisation

- ▶ Initialise the value  $v$  of  $G$  with  $v = \alpha$ .
- ▶ Stop maximising as soon as  $v \geq \beta$ .
- ▶ On the next level set

$$\alpha_{\text{new}} = -\beta_{\text{old}}, \\ \beta_{\text{new}} = -v.$$

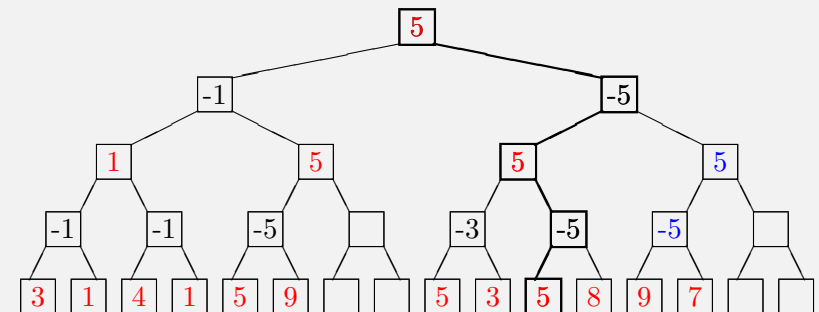


## Improved Programme

```
int value(Position p, int alpha, int beta) {
  if( endPosition(p) )
    return F(p);
  int v = alpha;
  while( nextChild(p, q) && v < beta )
    v = max( v, -value(q, -beta, -v) );
  return v;
}
```



## Tree with Pruning



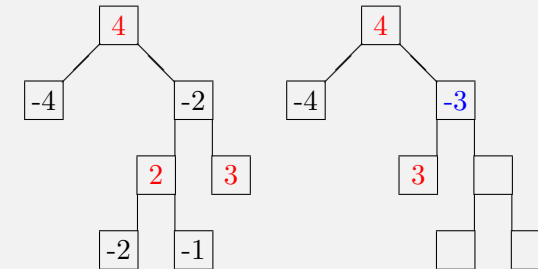


## Best Case

- ▶ For every position the first possible draw leads to an optimum, i.e. the values are ordered increasingly on every level.
- ▶ The algorithm only checks the optimal positions.
- ▶ Any other algorithm has at least the same cost.



## Counter Example



## Worst Case

- ▶ There is always a permutation of the positions such that all positions must be checked.
- ▶ Any other algorithm has at least the same cost.



## Generic Case

- ▶  $h$  height of the tree (= number of levels)
- ▶  $d$  width of the tree (= number of possible draws per position)
- ▶ The cost is proportional to  $(r_d)^h$  with a number  $r_d$  depending on  $d$ .
- ▶  $1 \leq r_d \leq d$
- ▶  $r_2 \approx 1.8$
- ▶  $r_3 \approx 2.5$
- ▶  $r_d \approx \frac{d}{\ln d}$



## Mathematical Tools

- ▶ Combinatorics
- ▶ Generating functions for the analysis of the recursions
- ▶ Perron-Frobenius Theorems for the asymptotic behaviour of  $r$



## Game-Dependent Modifications

- ▶ Ad hoc evaluation of positions without search
- ▶ Use of symmetries
- ▶ Hash-tables of already analysed positions
- ▶ Opening libraries
- ▶ End-game libraries



## Winning Strategies

- ▶ Player A has a **winning strategy**, if player B cannot prevent A from winning even when playing optimally.
- ▶ At most one player can have a winning strategy.



## Strategies for a Tie

- ▶ Player A has a **strategy for a tie**, if player B cannot avoid a tie even when playing optimally.
- ▶ Both players can have a strategy for a tie.



## Decidability

- ▶ A game is **decidable**, if one player has a winning strategy or both players have a strategy for a tie.
- ▶ A game is **fair**, if both players have a strategy for a tie.



## Known Results

- ▶  $4 \times 4$  Othello: black wins.
- ▶  $6 \times 6$  Othello: black wins.  
(Feinstein 1993, 5 weeks on a workstation,  $10^{10}$  positions)
- ▶ Nine Men's Morris is fair.  
(Gasser-Nievergelt 1994, 3 years on a PC-cluster, forward-backward-search, 49 sub-spaces with  $10^6 - 10^{10}$  positions, use symmetries)
- ▶ Checkers is fair.  
(Schaeffer-Lake 2007, forward-backward-search, sub-spaces with up to  $10^{18}$  positions)



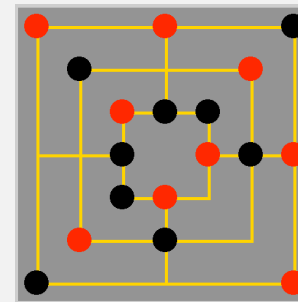
## Expected Results

- ▶  $8 \times 8$  Othello may be fair  
(about  $10^{37}$  positions)
- ▶ Chess may be fair  
(about  $10^{44}$  positions)
- ▶ Go may be fair (??)  
(about  $10^{170}$  positions)



## “High Noon”

- ▶ Who draws loses.



- ▶ Red loses after 37 draws.
- ▶ Black loses after 30 draws.






## A quoi bon?

- ▶ Economy (Nash-equilibrium)
- ▶ Data mining
- ▶ Classification and regression trees
- ▶ Fast solvers for upwind discretizations of diffusion-convection equations



## References

-  J. Bewersdorff  
*Luck, logic and white lies: The mathematics of games*  
A K Peters, 2004
-  Handout of this talk  
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