#### Monte-Carlo Proof-Number Search for Computer Go

Authors: Jahn-Takeshi Saito, Guillaume Chaslot, Jos W.H.M. Uiterwijk, and H. Jaap van den Herik

Presenter: Philip Henderson

#### **Overview**

- Proof Number Search
- MCPNS
- Experimental Setup
- Results and Analysis
- Conclusions and Future Work

## **Proof Number Search**

- Introduced by Allis at al. (1994)
- Goal: to prove the value of a game
- Solved Connect-4, Qubic, Go-Moku
- Variants by Breuker, Nagai, Winands et al.
- Applied to combinatorial games: shogi, go, checkers

# **PNS Details (1)**

- Most proving node: node which can contribute the most to the establishment of the root's minimax value with the least possible effort
- At max nodes, select branch where likely to prove value 1 with least effort
- At min nodes, select branch where likely to prove value 0 with least effort

# **PNS Details (2)**

- At each node visited, store (proof number, disproof number)
- Final game states: win =  $(0, \infty)$ , loss =  $(\infty, 0)$
- Temporary leaves: (1,1) assumes win/loss have equal chance
- Max internal nodes: (min proof number of children, sum of disproof numbers of children)
- Min internal nodes: (sum of proof numbers of children, min disproof number of children)





# **PNS Example** MA MIN (1,2) (1,3)(1,1) (1,1) (1,1)MA (1,1) (1,1) (1,1) (1,1) (1,1)







#### MCPNS

- PNS uses no domain-dependent information
- For temporary leaves, win/loss are not always equally likely
- MC can provide us a better estimate of win/loss likelihood
- Use MC to give proof/disproof numbers in range (0, 1] for temp leaves

#### Tests

- 30 tsumego, 10k 1d level from GoBase
- Alive/dead categorization only (ko and seki omitted)
- All positions advantageous for Black (who moves first)
- Annotations added for which groups to be decided and which intersections playable  $(I \in [8, 20])$

## **MCPNS Parameters**

- **N** number of simulated games  $\in (3, 5, 10, 20)$
- la lookahead depth (max length of gameplay)  $\in (3, 5, 10)$
- depth level at which start using MC as a guide  $\in (I, I/2, 3I/4)$

## **Additional Info**

- 32 GB of working memory available
- Implemented in C++
- MANGO used for MC evaluation, no adaptation for tsumego
- Each test repeated 20 times, aggregates analyzed
- MCPNS variants compared with basic PNS

#### Results

- Fastest:  $p_{fast} = (3, 10, 3)$  twice as fast, expands < 1/4 the nodes
- Smallest:  $p_{narrow} = (20, 10, 3)$  expands < 1/5nodes, but a little slower than PNS
- MCPNS variants expand fewer nodes than PNS
- Time required is more variable PNS fastest in 6 cases, tied for fastest in another 6



- Tradeoff between number nodes expanded and time spent per node
- MC is time-costly, so use few of these
- PNS fastest on simpler problems, but for complex problems the absolute time savings by MCPNS are significant: 47 seconds versus 6 seconds on most complex problem

## Conclusions

- Added domain dependent info to PNS by using MC
- Fewer nodes expanded, but higher time cost per node
- Correct choice of parameters is faster for more complex problems

## **Future Work**

- Larger and more complex problem set needs to be tested
- Only aggregates analyzed, how large is variance of MCPNS
- Use this idea to extend Depth-First PNS

# **Any Questions?**