

## Supplementary Material for Batch Monte Carlo Tree Search

Algorithm 1 gives the main PUCT search algorithm using a transposition table of evaluated states and the two trees. The `GetBatch` boolean is used to make the distinction between the first option to develop the tree and the second option to build the batch. The first tree is the main search tree while the second tree is only used to build the batch.

The modifications of the search algorithm that implement the Second Move heuristic are given in algorithm 3. Lines 33-39 modify the best move to try at the root when the most simulated move is unreachable. In this case the second most simulated move is preferred.

Algorithm 2 gives the modifications of the `GetMove` algorithm for using the Second Move heuristic. Lines 8-17 choose between the most simulated move and the second most simulated move according to their means.

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### Algorithm 1 The BatchPUCT algorithm

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```

1: Function BatchPUCT ( $s, GetBatch$ )
2:   if isTerminal ( $s$ ) then
3:     return Evaluation ( $s$ )
4:   end if
5:   if  $GetBatch$  then
6:      $t \leftarrow treeBatch$ 
7:   else
8:      $t \leftarrow tree$ 
9:   end if
10:  if  $s \notin t$  then
11:    if  $s \notin$  transposition table then
12:      if  $GetBatch$  then
13:        add  $s$  to the batch
14:      end if
15:      return Unknown
16:    else
17:      add  $s$  to  $t$ 
18:      return value ( $s$ )
19:    end if
20:  end if
21:   $bestScore \leftarrow -\infty$ 
22:  for  $m \in$  legal moves of  $s$  do
23:     $\mu \leftarrow FPU$ 
24:    if  $t.p(s, m) > 0$  then
25:       $\mu \leftarrow \frac{t.sum(s, m)}{t.p(s, m)}$ 
26:    end if
27:     $bandit \leftarrow \mu + c \times t.prior(s, m) \times \frac{\sqrt{t.p(s)}}{1+t.p(s, m)}$ 
28:    if  $bandit > bestScore$  then
29:       $bestScore \leftarrow bandit$ 
30:       $bestMove \leftarrow m$ 
31:    end if
32:  end for
33:   $s_1 \leftarrow play(s, bestMove)$ 
34:   $res \leftarrow BatchPUCT(s_1, GetBatch)$ 
35:  if  $GetBatch$  then
36:    UpdateStatisticsGet ( $res, bestMove, s, t$ )
37:  else
38:    UpdateStatistics ( $res, bestMove, s, t$ )
39:  end if
40:  return  $res$ 

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**Algorithm 2** The GetMoveSecondHeuristic algorithm

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1: Function GetMoveSecondHeuristic ( $s, B$ )
2:    $b \leftarrow \text{size}(\text{batch})$ 
3:   for  $i \leftarrow 0$  to  $B$  do
4:     GetBatchSecond ( $s, B \times b, i \times b$ )
5:      $\text{out} \leftarrow \text{Forward}(\text{batch})$ 
6:     PutBatchSecond ( $\text{out}, B \times b, i \times b$ )
7:   end for
8:    $t \leftarrow \text{tree}$ 
9:    $\text{best} \leftarrow \text{bestMove}_m(t.p(s, m))$ 
10:   $\mu \leftarrow \frac{t.\text{sum}(s, \text{best})}{t.p(s, \text{best})}$ 
11:   $\text{secondBest} \leftarrow \text{secondBestMove}_m(t.p(s, m))$ 
12:   $\mu_1 \leftarrow \frac{t.\text{sum}(s, \text{secondBest})}{t.p(s, \text{secondBest})}$ 
13:  if  $\mu_1 > \mu$  then
14:    return  $\text{secondBest}$ 
15:  else
16:    return  $\text{best}$ 
17:  end if
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**Algorithm 3** The BatchSecond algorithm

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```
1: Function BatchSecond ( $s, \text{GetBatch}, \text{budget}, i, \text{root}$ )
2:   if isTerminal ( $s$ ) then
3:     return Evaluation ( $s$ )
4:   end if
5:   if  $\text{GetBatch}$  then
6:      $t \leftarrow \text{treeBatch}$ 
7:   else
8:      $t \leftarrow \text{tree}$ 
9:   end if
10:  if  $s \notin t$  then
11:    if  $s \notin$  transposition table then
12:      if  $\text{GetBatch}$  then
13:        add  $s$  to the batch
14:      end if
15:      return Unknown
16:    else
17:      add  $s$  to  $t$ 
18:      return value ( $s$ )
19:    end if
20:  end if
21:   $\text{bestScore} \leftarrow -\infty$ 
22:  for  $m \in$  legal moves of  $s$  do
23:     $\mu \leftarrow \text{FPU}$ 
24:    if  $t.p(s, m) > 0$  then
25:       $\mu \leftarrow \frac{t.\text{sum}(s, m)}{t.p(s, m)}$ 
26:    end if
27:     $\text{bandit} \leftarrow \mu + c \times t.\text{prior}(s, m) \times \frac{\sqrt{1+t.p(s)}}{1+t.p(s, m)}$ 
28:    if  $\text{bandit} > \text{bestScore}$  then
29:       $\text{bestScore} \leftarrow \text{bandit}$ 
30:       $\text{bestMove} \leftarrow m$ 
31:    end if
32:  end for
33:  if root then
34:     $b \leftarrow \text{highestValue}_m(t.p(s, m))$ 
35:     $b_1 \leftarrow \text{secondHighestValue}_m(t.p(s, m))$ 
36:    if  $b \geq b_1 + \text{budget} - i$  then
37:       $\text{bestMove} \leftarrow \text{secondBestMove}_m(t.p(s, m))$ 
38:    end if
39:  end if
40:   $s_1 \leftarrow \text{play}(s, \text{bestMove})$ 
41:   $\text{res} \leftarrow \text{BatchSecond}(s_1, \text{GetBatch}, \text{budget}, i, \text{False})$ 
42:  if  $\text{GetBatch}$  then
43:    UpdateStatisticsGet ( $\text{res}, \text{bestMove}, s, t$ )
44:  else
45:    UpdateStatistics ( $\text{res}, \text{bestMove}, s, t$ )
46:  end if
47:  return  $\text{res}$ 
```

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