maxpumperla / deep_learning_and_the_game_of_go Public ?? Pull requests 5 Actions Projects Security ✓ Insights <> Code ○ Issues 46 deep_learning_and_the_game_of_go / code / dlgo / mcts / mcts.py / <> Jump to ▼ ሦ master ▼ Go to file . . . maxpumperla update master Latest commit bff1d26 on 27 Aug 2018 (3) History A 1 contributor G 171 lines (146 sloc) 5.12 KB Raw Blame import math 1 2 import random 3 from dlgo import agent 4 from dlgo.gotypes import Player 5 from dlgo.utils import coords_from_point 6 7 $_{all} = [$ 8 'MCTSAgent', 9 10 11 12 def fmt(x): 13 14 if x is Player.black: 15 return 'B' if x is Player.white: 16 17 return 'W' if x.is_pass: 18

```
return 'pass'
19
20
         if x.is_resign:
             return 'resign'
21
22
         return coords_from_point(x.point)
23
24
25
     def show_tree(node, indent='', max_depth=3):
26
         if max depth < 0:</pre>
27
             return
28
         if node is None:
29
             return
30
         if node.parent is None:
31
             print('%sroot' % indent)
32
         else:
33
             player = node.parent.game_state.next_player
34
             move = node.move
35
             print('%s%s %s %d %.3f' % (
36
                 indent, fmt(player), fmt(move),
37
                 node.num_rollouts,
38
                 node.winning_frac(player),
39
             ))
40
         for child in sorted(node.children, key=lambda n: n.num_rollouts, reverse=True):
             show_tree(child, indent + ' ', max_depth - 1)
41
42
43
     # tag::mcts-node[]
44
     class MCTSNode(object):
45
46
         def __init__(self, game_state, parent=None, move=None):
47
             self.game_state = game_state
48
             self.parent = parent
49
             self.move = move
50
             self.win_counts = {
                 Player.black: 0,
51
                 Player.white: 0,
52
53
```

```
self.num rollouts = 0
54
55
             self.children = []
             self.unvisited_moves = game_state.legal_moves()
56
57
     # end::mcts-node[]
58
     # tag::mcts-add-child[]
59
         def add random child(self):
60
61
             index = random.randint(0, len(self.unvisited moves) - 1)
62
             new move = self.unvisited moves.pop(index)
63
             new_game_state = self.game_state.apply_move(new_move)
64
             new_node = MCTSNode(new_game_state, self, new_move)
65
             self.children.append(new node)
             return new node
66
     # end::mcts-add-child[]
67
68
69
     # tag::mcts-record-win[]
70
         def record win(self, winner):
71
             self.win_counts[winner] += 1
72
             self.num_rollouts += 1
73
     # end::mcts-record-win[]
74
75
     # tag::mcts-readers[]
76
         def can_add_child(self):
77
             return len(self.unvisited_moves) > 0
78
79
         def is_terminal(self):
80
             return self.game_state.is_over()
81
82
         def winning_frac(self, player):
83
             return float(self.win_counts[player]) / float(self.num_rollouts)
84
     # end::mcts-readers[]
85
86
87
     class MCTSAgent(agent.Agent):
88
         def __init__(self, num_rounds, temperature):
```

```
89
              agent.Agent. init (self)
 90
              self.num rounds = num rounds
 91
              self.temperature = temperature
 92
 93
      # tag::mcts-signature[]
 94
          def select_move(self, game_state):
              root = MCTSNode(game_state)
 95
 96
      # end::mcts-signature[]
 97
      # tag::mcts-rounds[]
 98
 99
              for i in range(self.num rounds):
                  node = root
100
                  while (not node.can add child()) and (not node.is terminal()):
101
                      node = self.select child(node)
102
103
                  # Add a new child node into the tree.
104
105
                  if node.can add child():
                      node = node.add random child()
106
107
                  # Simulate a random game from this node.
108
                  winner = self.simulate random game(node.game state)
109
110
                  # Propagate scores back up the tree.
111
112
                  while node is not None:
113
                      node.record win(winner)
                      node = node.parent
114
115
      # end::mcts-rounds[]
116
              scored_moves = [
117
118
                  (child.winning_frac(game_state.next_player), child.move, child.num_rollouts)
119
                  for child in root.children
120
              scored_moves.sort(key=lambda x: x[0], reverse=True)
121
122
              for s, m, n in scored moves[:10]:
                  print('%s - %.3f (%d)' % (m, s, n))
123
```

```
124
125
      # tag::mcts-selection[]
126
              # Having performed as many MCTS rounds as we have time for, we
127
              # now pick a move.
128
              best move = None
129
              best pct = -1.0
130
              for child in root.children:
131
                  child pct = child.winning frac(game state.next player)
132
                  if child pct > best pct:
133
                      best pct = child pct
134
                      best move = child.move
135
              print('Select move %s with win pct %.3f' % (best_move, best_pct))
              return best_move
136
      # end::mcts-selection[]
137
138
      # tag::mcts-uct[]
139
140
          def select child(self, node):
              """Select a child according to the upper confidence bound for
141
142
              trees (UCT) metric.
143
              total rollouts = sum(child.num rollouts for child in node.children)
144
              log rollouts = math.log(total rollouts)
145
146
147
              best_score = -1
148
              best child = None
              # Loop over each child.
149
150
              for child in node.children:
151
                  # Calculate the UCT score.
152
                  win_percentage = child.winning_frac(node.game_state.next_player)
153
                  exploration_factor = math.sqrt(log_rollouts / child.num_rollouts)
154
                  uct_score = win_percentage + self.temperature * exploration_factor
155
                  # Check if this is the largest we've seen so far.
156
                  if uct_score > best_score:
157
                      best score = uct score
158
                      best child = child
```

```
159
              return best_child
      # end::mcts-uct[]
160
161
          @staticmethod
162
163
          def simulate_random_game(game):
              bots = {
164
165
                  Player.black: agent.FastRandomBot(),
                  Player.white: agent.FastRandomBot(),
166
              }
167
              while not game.is_over():
168
                  bot_move = bots[game.next_player].select_move(game)
169
                  game = game.apply_move(bot_move)
170
              return game.winner()
171
```