

```
1 #include <iostream>
2 #include "game_assets/game.h"
3 #include "ai/aiRandom.h"
4 #include "ai/aiOwn.h"
5 #include <thread>
6 #include <vector>
7 #include "random.h"
8 #include "hand_eval/2+2/2P2Evaluator.h"
9 #include <sys/time.h>
10 #include <random>
11 #include "hand_eval/handEvalCalc.h"
12 #include "ai/aiCaller.h"
13 #include "ai/aiFolder.h"
14 #include "ai/aiRaiser.h"
15
16 bool sScoreGreater Than(const std::pair<long, long>& a, const std::pair<long, long>& b) {
17     return a.first > b.first;
18 }
19
20 bool sMoneyGreater Than(const std::pair<double, long>& a, const std::pair<double, long>& b) {
21     return a.first > b.first;
22 }
23
24 inline double my_clock(void) {
25     struct timeval t;
26     gettimeofday(&t, NULL);
27     return (1.0e-6*t.tv_usec + t.tv_sec);
28 }
29
30 // Forward Declaration
31 Rules* defineRules();
32
33 std::vector<Player*> runOneGeneration(std::vector<Player*> &players, Rules* rules, int numElitePlayersToKeep,
34                                         int numTourney, std::vector<Player*> &hallOfFame);
35 std::vector<Player*> runOneGenerationWithMultiThreading(std::vector<Player*> players, int numElitePlayersToKeep,
36                                                       int numTourney, int numThreads);
37 std::vector<long> startOneGameCicle(Game *game, std::vector<std::vector<long>> &resultVector, int id);
38 void evolvePlayers(std::vector<Player*> players, const std::vector<Player*> elitePlayers, double mutationLikelihood);
39 bool saveNeuralNetworkWeightsToFile(std::vector<double> weights);
40 bool loadNeuralNetworkWeightsIntoArray();
41 void initializeHallOfFame(std::vector<Player*> &players, std::vector<Player*> &hallOfFame);
42 void initializeHallOfFameWithOwnAi(std::vector<Player*> &players, std::vector<Player*> &hallOfFame);
43 void updateHallOfFame(std::vector<Player*> &players, std::vector<Player*> elite, std::vector<Player*> &hallOfFame);
44
```

```
45 double weightsLoaded[NUM_OF_NN_WEIGHTS];
46 int generation = 0;
47
48 int NUM_AI_AGENTS = 52;
49 int NUM_HALL_OF_FAME = GLOBAL_NUM_PLAYERS - NUM_AI_AGENTS;
50
51 int NUM_AI_FOLD = 12;
52 int NUM_AI_CALL = 8;
53 int NUM_AI_RAISE = 7;
54 int NUM_AI_RANDOM = 7;
55
56
57 int NUM_ELITE_PLAYERS = 5; // TODO Some calculations in the evolve methode use hardcoded values so change it
58 std::vector<unsigned> topo {16,8,3};
59
60 int num0fGenerations = 500;
61 int num0fTournaments = 100;
62
63 int main() {
64     //////////// SETUP ////////////
65
66     seedRandomFastWithRandomSlow();
67     // Setup 2+2 method
68     TPTEvaluator::initEvaluator();
69
70     //Load Preflop Lookup Tables
71     TPTEvaluator::loadPreflopTables();
72
73     //////////// PLAYER CREATION ////////////
74
75     // Creating the players for the first generation
76     std::vector<Player*> players;
77     std::vector<Player*> hall0fFame;
78
79     for (int i = 0; i < NUM_AI_AGENTS; i++) {
80         Player *player;
81         AI0wn *ai = new AI0wn();
82         ai->setTopology(topo);
83         player = new Player(ai);
84         player->setID(i);
85         players.push_back(player);
86     }
87 }
88 }
```

```

89     //initializeHallOfFame(players, hallOfFame);
90     initializeHallOfFameWithOwnAi(players, hallOfFame);
91
92     //////////////////// RUN GAMES ///////////////////
93     double start_time, end_time;
94     start_time = my_clock();
95
96     for (int i = 0; i < numOfGenerations; i++) {
97
98         // Setup the rules
99         Rules* rules = defineRules();
100
101        // Keep x% of the best players
102        int numofElitePlayersToKeep = NUM_ELITE_PLAYERS;
103
104        // elite players per generation
105
106        std::vector<Player*> elite;
107        // Run one Generation
108        elite = runOneGeneration(players, rules, numofElitePlayersToKeep, numofTournaments, hallOfFame);
109
110        // DO THE EVOLUTION
111        double mutationLikelihood = 0.10;
112
113        std::vector<Player*> playersToEvolve(players.begin(), players.begin() + NUM_AI_AGENTS);
114        evolvePlayers(playersToEvolve, elite, mutationLikelihood);
115
116        saveNeuralNetworkWeightsToFile(dynamic_cast<AI0wn *>(elite.at(0)->getAI())->net_.getOutputWeights());
117        //saveNeuralNetworkWeightsToFile(dynamic_cast<AI0wn *>(players.at(0)->getAI())->net_.getOutputWeights());
118        //loadNeuralNetworkWeightsIntoArray(); //This fills the global array
119
120        delete rules;
121        std::cout << "GENERATION-NR: " << i << " DONE" << std::endl;
122        generation++;
123    }
124
125    end_time = my_clock();
126    double totalTime = end_time - start_time;
127    std::cout << "Full " << numOfGenerations << " generations took: " << totalTime << "seconds" << std::endl;
128
129    return 0;
130 }
131
132 void evolvePlayers(std::vector<Player*> players, const std::vector<Player*> elitePlayers, double mutationLikelihood) {

```

```

133 // Should I use this as generator setup?
134 //std::random_device rd; //Will be used to obtain a seed for the random number engine
135 //std::mt19937 gen(rd()); //Standard mersenne_twister_engine seeded with rd()
136
137 unsigned seed = std::chrono::system_clock::now().time_since_epoch().count();
138 std::default_random_engine generator(seed);
139 std::discrete_distribution<int> distribution {2,10,4,2,2}; //TODO change this values when elite number players changes
140 std::uniform_int_distribution<int> uniformDistribution(0,4); //TODO change this values when elite number players changes
141 std::uniform_real_distribution<> uniformRealDistribution(0,1);
142 std::normal_distribution<double> normalDistribution(0, 0.1);
143
144 //Before creating children save the elite players at the beginning of the players vector and
145 // swap them with the current players there so you just mutate the rest
146 std::vector<Player*> tempPlayers;
147
148 for (auto &elitePlayer: elitePlayers) {
149     tempPlayers.push_back(elitePlayer);
150 }
151
152 for (auto &player: players) {
153     if(std::find(tempPlayers.begin(), tempPlayers.end(), player) == tempPlayers.end())
154     {
155         //player does not exist in tempPlayers, add him
156         tempPlayers.push_back(player);
157     }
158 }
159
160 //What if elitePlayers count = 1?
161 for (long p = elitePlayers.size(); p < tempPlayers.size(); p++) {
162     // get random number of parents
163     // should be an exponential distribution so that 2 is most likely but 1 and more is also likely
164     //TODO look this up how it should be
165     // for now i just hardcode my values
166     int parentCount = distribution(generator) + 1; // because range is 0...3
167     std::vector<Player *> parents;
168     std::vector<double> parentsEvolutionWeights;
169
170     for (int i = 0; i < parentCount; i++) {
171         //TODO should the same player be able to be selected twice as parent?
172         //TODO In the paper they are not allowed to be selected twice
173         int index = uniformDistribution(generator);
174         parents.push_back(elitePlayers.at(index));
175
176

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177     double weight = uniformRealDistribution(generator);
178     parentsEvolutionWeights.push_back(weight);
179 }
180
181 //normalize weights
182 double sum = 0.0;
183 for (auto &weight: parentsEvolutionWeights)
184     sum += weight;
185
186 for (auto &weight: parentsEvolutionWeights)
187     weight = weight / sum;
188
189 // for each link of the neural network calculate the new value
190 std::vector<double> childWeights = dynamic_cast<AI0wn *>(tempPlayers.at(p)->getAI())->net_.getOutputWeights();
191
192 for (int w = 0; w < childWeights.size(); w++) {
193     double value = 0.0;
194     for (int par = 0; par < parents.size(); par++) {
195         std::vector<double> parentWeights = dynamic_cast<AI0wn *>(parents.at(
196             par)->getAI())->net_.getOutputWeights();
197         value += parentWeights[w] * parentsEvolutionWeights[par];
198     }
199
200     //add random noise with a likelihood
201     double random = uniformRealDistribution(generator);
202     if (random < mutationLikelihood) {
203         //Choose a normal distribution with mean = 0 and std = 0.1
204         // This promotes many small changes as opposed to a few large changes
205         // TODO Check if this works by calculating it by hand and breakpoint
206         // TODO if the values are too big
207         double noiseValue = normalDistribution(generator);
208         //TODO check if noise would yiels > 1 or < -1 value, then just add enough to cap it
209         value += noiseValue;
210     }
211     childWeights.at(w) = value;
212 }
213
214 // give child the new weights
215 dynamic_cast<AI0wn *>(tempPlayers.at(p)->getAI())->net_.setOutputWeights(childWeights);
216 }
217 }
218
219 std::vector<Player*> runOneGeneration(std::vector<Player*> &players, Rules* rules, int numElitePlayersToKeep,
220                                         int numTourney, std::vector<Player*> &hallOfFame) {

```

```

221 // Create a game
222 Game game;
223 game.setRules(rules);
224
225 // Add players to the game
226 for (auto &player: players) {
227     game.addPlayer(player);
228 }
229
230
231 double start_time, end_time;
232 start_time = my_clock();
233
234 // Play #num of games with the same agents
235 for (long i = numTourney; i > 0; i--) {
236     game.playGame();
237     game.cleanUpGame();
238     std::cout << "game " << i << " finsihed!" << std::endl;
239 }
240 end_time = my_clock();
241 double time = end_time - start_time;
242 std::cout << numTourney << " games took: " << time << std::endl;
243
244
245 //////////////////// EVALUATE FITNESSFUNCTIONS ///////////////////
246
247 /// 1.) AVERAGE PLACEMENT PLACED
248 // Sort players by performance
249 std::vector<std::pair<long, long>> gameResultsPaired;
250 std::vector<long> gameResults = game.getOverallGameResults();
251 for (int i = 0; i < gameResults.size(); i++) {
252     gameResultsPaired.push_back(std::make_pair(gameResults[i], i));
253 }
254
255 // now gameResultsPaired holds an ascending list of pairs - pair.first = value, pair.second = index
256 std::sort(gameResultsPaired.begin(), gameResultsPaired.end());
257
258 float total = 0.0;
259 for (auto &pair : gameResultsPaired) {
260     std::cout << "Player " << pair.second << " average place: " << pair.first / (float)numTourney << std::endl;
261     total += pair.first / (float)numTourney;
262 }
263 std::cout << "Total: " << total << std::endl;
264

```

```

265     /// 2.) HANDS WON PLACED
266     std::vector<std::pair<long, long>> handsWonPaired;
267     std::vector<long> handsWonResults = game.getOverallHandsWonResults();
268     for (int i = 0; i < handsWonResults.size(); i++) {
269         handsWonPaired.push_back(std::make_pair(handsWonResults[i], i));
270     }
271
272     // now handsWonResults holds a list where .second is the playerID and .first is his hands won
273     std::sort(handsWonPaired.begin(), handsWonPaired.end(), sScoreGreaterThan);
274
275     float totalHandsWon = 0.0;
276     for (auto &pair : handsWonPaired) {
277         std::cout << "Player " << pair.second << " hands won: " << pair.first << std::endl;
278         totalHandsWon += pair.first;
279     }
280     std::cout << "Total hands won by all players: " << totalHandsWon << std::endl;
281
282     /// 3.) MEAN MONEY WON
283     std::vector<std::pair<double, int>> meanMoneyWonPaired;
284     std::vector<double> meanMoneyWonResults = game.getMeanMoneyWonResults();
285     for (int i = 0; i < meanMoneyWonResults.size(); i++) {
286         meanMoneyWonPaired.push_back(std::make_pair(meanMoneyWonResults[i], i));
287     }
288
289     std::sort(meanMoneyWonPaired.begin(), meanMoneyWonPaired.end(), sMoneyGreaterThan);
290
291     for (auto &pair : meanMoneyWonPaired) {
292         std::cout << "Player " << pair.second << " mean money won: " << pair.first << std::endl;
293     }
294
295     /// COMBINE ALL 3 TOGETHER
296     std::vector<std::pair<double, int>> placeAndHandsWonPaired;
297
298     for (int p = 0; p < gameResultsPaired.size(); p++) { // This ranks them according to their fitness
299         gameResultsPaired[p].first = p + 1;
300         handsWonPaired[p].first = p + 1;
301         meanMoneyWonPaired[p].first = p + 1;
302     }
303
304     for (int i = 0; i < gameResultsPaired.size(); i++) {
305         for (int j = 0; j < handsWonPaired.size(); j++) {
306             for (int k = 0; k < meanMoneyWonPaired.size(); k++) {
307                 int index1 = gameResultsPaired[i].second;
308                 int index2 = handsWonPaired[j].second;

```

```

309         int index3 = meanMoneyWonPaired[k].second;
310
311         if (index1 == index2 && index2 == index3) {
312             double fitnessScore = gameResultsPaired[i].first * FITNESS_WEIGHT_1 +
313                             handsWonPaired[j].first * FITNESS_WEIGHT_2 +
314                             meanMoneyWonPaired[k].first * FITNESS_WEIGHT_3;
315
316             placeAndHandsWonPaired.push_back(std::make_pair(fitnessScore, index1));
317         }
318     }
319 }
320
321 // sort descendingly (best player, lowest score)
322 std::sort(placeAndHandsWonPaired.begin(), placeAndHandsWonPaired.end());
323
324
325 for (auto &pair : placeAndHandsWonPaired) {
326     std::cout << "Player " << pair.second << " fitnessScore: " << pair.first << std::endl;
327     totalHandsWon += pair.first;
328 }
329
330 //////////// GET BEST PLAYERS OF OWN-AI ///////////
331 // keep #num of elite players and return them
332 std::vector<Player*> elitePlayers;
333 elitePlayers.resize(numElitePlayersToKeep);
334 int eliteIndex = 0;
335 int hallOfFameIndex = 0;
336 for (int i = 0; i < players.size(); i++) {
337     //Set players overall ranking
338     players[placeAndHandsWonPaired[i].second]->overallRanking_ = i + 1;
339
340     //Check if agent is hallOfFame member or not
341     // If it is sort the hallOfFame
342     if (!players[placeAndHandsWonPaired[i].second]->hallOfFameMember_ && eliteIndex < NUM_ELITE_PLAYERS) {
343         elitePlayers.at(eliteIndex) = players[placeAndHandsWonPaired[i].second];
344         eliteIndex++;
345     } else if (players[placeAndHandsWonPaired[i].second]->hallOfFameMember_){ // This sorts the hallOfFame
346         hallOfFame.at(hallOfFameIndex) = players[placeAndHandsWonPaired[i].second];
347         hallOfFameIndex++;
348     }
349 }
350
351 //UPDATE HALL OF FAME
352 updateHallOfFame(players, elitePlayers, hallOfFame);

```

```
353
354     // RESETTING THE GAME STATISTICS AFTER EACH GENERATION
355     game.resetStatistics();
356
357     // Returning the top players that we want to keep
358     return elitePlayers;
359 }
360
361 void initializeHallOfFame(std::vector<Player*> &players, std::vector<Player*> &hallOfFame) {
362
363     for (int i = NUM_AI_AGENTS; i < NUM_AI_AGENTS + NUM_AI_RANDOM; i++) {           // random
364         Player *player;
365         player = new Player(new AIRandom());
366         player->setID(i);
367         player->hallOfFameMember_ = true;
368         players.push_back(player);
369         hallOfFame.push_back(player);
370     }
371
372     for (int i = NUM_AI_AGENTS + NUM_AI_RANDOM; i < NUM_AI_AGENTS + NUM_AI_RANDOM + NUM_AI_CALL; i++) {           // call
373         Player *player;
374         player = new Player(new AICall());
375         player->setID(i);
376         player->hallOfFameMember_ = true;
377         players.push_back(player);
378         hallOfFame.push_back(player);
379     }
380
381     for (int i = NUM_AI_AGENTS + NUM_AI_RANDOM + NUM_AI_CALL; i <
382          NUM_AI_AGENTS + NUM_AI_RANDOM + NUM_AI_CALL + NUM_AI_RAISE; i++) {           // raiser
383         Player *player;
384         player = new Player(new AIRaiser());
385         player->setID(i);
386         player->hallOfFameMember_ = true;
387         players.push_back(player);
388         hallOfFame.push_back(player);
389     }
390
391     for (int i = NUM_AI_AGENTS + NUM_AI_RANDOM + NUM_AI_CALL + NUM_AI_RAISE; i <
392          NUM_AI_AGENTS + NUM_AI_RANDOM + NUM_AI_CALL + NUM_AI_RAISE + NUM_AI_FOLD; i++) {           // fold
393         Player *player;
394         player = new Player(new AIFold());
395         player->setID(i);
396         player->hallOfFameMember_ = true;
```

```

397     players.push_back(player);
398     hallOfFame.push_back(player);
399 }
400 }
401
402 void initializeHallOfFameWithOwnAi(std::vector<Player*> &players, std::vector<Player*> &hallOfFame) {
403
404     for (int i = NUM_AI_AGENTS; i < GLOBAL_NUM_PLAYERS; i++) {           // random
405         AIOwn *ai = new AIOwn();
406         Player *player;
407         player = new Player(ai);
408         player->setID(i);
409         player->hallOfFameMember_ = true;
410         players.push_back(player);
411         hallOfFame.push_back(player);
412     }
413 }
414
415 void updateHallOfFame(std::vector<Player*> &players, std::vector<Player*> elite, std::vector<Player*> &hallOfFame) {
416     // Check if elite players performed better than worst hallOfFamePlayers, if so replace them
417     // Clone the player that replaces the worst player and set its id to the replaced player's id.
418     // Also set the hallOfFame flag to TRUE
419     // also don't forget to replace the player in the players vector
420     int j = 0;
421     for (int i = 0; i < elite.size(); i++) {
422         if (hallOfFame.at(NUM_HALL_OF_FAME - elite.size() + i)->overallRanking_ > elite.at(j)->overallRanking_) {
423             // Copy elite player and replace it with current hallOfFame player
424             Player *copyElitePlayer = new Player(*elite.at(j));
425
426             // set id to old players id and set the hallOfFame flag
427             copyElitePlayer->setID(hallOfFame.at(NUM_HALL_OF_FAME - elite.size() + i)->getID());
428             copyElitePlayer->hallOfFameMember_ = true;
429             hallOfFame.at(NUM_HALL_OF_FAME - elite.size() + i) = copyElitePlayer;
430             players.at(copyElitePlayer->getID()) = copyElitePlayer;
431             j++;
432         }
433     }
434 }
435
436 Rules* defineRules() {
437     // Set the rules
438     Rules *rules = new Rules();
439     rules->buyIn_ = 1500;
440     rules->blindLevel_ = BlindLevel(10, 20, 3);

```

```
441 // How many players do compete in the game
442 rules->totalNumberOfPlayers_ = GLOBAL_NUM_PLAYERS;
443
444 // How many players should participate?
445 // 9 players per table are allowed
446 rules->maxNumPlayersPerTable_ = 9;
447
448
449 return rules;
450 }
451
452 bool saveNeuralNetworkWeightsToFile(std::vector<double> weights) {
453 //////////////// SAVING /////////////////////////////////
454 // save weights array to file
455
456 double weightsArray[NUM_OF_NN_WEIGHTS] = {0};
457 for (int i = 0; i < weights.size(); i++) {
458     weightsArray[i] = weights.at(i);
459 }
460 std::string filename = "../LookupTables/nn_weightsGen" + std::to_string(generation) + ".dat";
461 FILE *fout = fopen(filename.c_str(), "wb");
462 if (!fout) {
463     printf("Problem creating the Output File!\n");
464     return 1;
465 }
466 fwrite(weightsArray, sizeof(weightsArray), 1, fout); // big write, but quick
467
468 fclose(fout);
469 return true;
470 }
471
472 bool loadNeuralNetworkWeightsIntoArray() {
473 printf("Loading nn_weights.DAT file...");  

474 memset(weightsLoaded, 0, sizeof(weightsLoaded));
475 FILE *fin = fopen("../LookupTables/nn_weights.dat", "rb");
476 if (!fin)
477     return false;
478 size_t bytesread = fread(weightsLoaded, sizeof(weightsLoaded), 1, fin); // get the HandRank Array
479 fclose(fin);
480 printf("complete.\n\n");
481 return true;
482 }
483
484
```

```

485 /// MULTITHREADED
486
487 std::vector<Player*> runOneGenerationWithMultiThreading(std::vector<Player*> players, int numElitePlayersToKeep, int numTourney, int
488 numThreads) {
489
490     std::vector<std::vector<long>> resultVector;
491     resultVector.resize(numTourney);
492
493     // Create a game
494     std::vector<Game *> gameVector;
495     std::vector<Rules *> rulesVector;
496
497     for (int i = 0; i < numTourney; i++) {
498         Game *game = new Game();
499         gameVector.push_back(game);
500         Rules *rules = defineRules();
501         rulesVector.push_back(rules);
502         game->setRules(rules);
503     }
504
505     // Add players to the game
506     // Be patient while multithreading... we can't give the players vector to all threads because they would
507     // manipulate all the pointers simultaneously!
508     // SOLUTION: we want to create a new players pointer vector for each game and also new AI but copy the values of
509     // the old ones -> copy constructor
510     for (auto &game: gameVector) {
511         for (auto &player: players) {
512             Player *newPlayer = new Player(*player); //Copy the players
513             newPlayer->setID(player->getID());
514             game->addPlayer(newPlayer);
515             newPlayer->getAI()->setName("New");
516         }
517     }
518     double start_time, end_time;
519     start_time = my_clock();
520
521     // Play #num of games with the same agents
522     std::vector<std::thread> t_vector;
523     int numGames = 0;
524     while (numGames < numTourney) {
525         for (int i = 0; i < numThreads; i++) {
526             t_vector.push_back(std::thread(startOneGameCicle, gameVector[numGames], std::ref(resultVector), numGames));
527             numGames++;
528         }
529     }
530
531     for (auto &t: t_vector) {
532         t.join();
533     }
534
535     return resultVector;
536 }

```

```
528     }
529
530     for (auto &thread: t_vector) {
531         thread.join();
532     }
533     if (numGames + t_vector.size() > numTourney) {
534         numThreads = numTourney - numGames;
535     }
536
537     t_vector.clear();
538 }
539
540
541 //TODO when to delete what?
542 for (auto &i : gameVector) {
543     delete i;
544 }
545
546 end_time = my_clock();
547 double time = end_time - start_time;
548 std::cout << numTourney << " games took: " << time << std::endl;
549
550 std::cout << "Got all results - ready to print" << std::endl;
551 std::vector<int> gameResults;
552 for (int i = 0; i < 45; i++) {
553     gameResults.push_back(0);
554 }
555
556 for (int i = 0; i < numTourney; i++) {
557     for (int j = 0; j < 45; j++) {
558         gameResults[j] += resultVector[i][j];
559     }
560 }
561 // Sort players by performance
562 std::vector<std::pair<int,int>> gameResultsPaired;
563 for (int i = 0; i < gameResults.size(); i++) {
564     gameResultsPaired.push_back(std::make_pair(gameResults[i], i));
565 }
566
567 // now gameResultsPaired holds an ascending list of pairs - pair.first = value, pair.second = index
568 std::sort(gameResultsPaired.begin(), gameResultsPaired.end());
569
570 // keep #num of elite players and return them
571 std::vector<Player*> elitePlayers;
```

```
572     elitePlayers.resize(numElitePlayersToKeep);
573     for (int i = 0; i < numElitePlayersToKeep; i++) {
574         elitePlayers.at(i) = players[gameResultsPaired.at(i).second];
575     }
576
577     float total = 0.0;
578     for (auto &pair : gameResultsPaired) {
579         std::cout << "Player " << pair.second << " average place: " << pair.first / (float)numTourney << std::endl;
580         total += pair.first / (float)numTourney;
581     }
582
583     std::cout << "Total: " << total << std::endl;
584
585     // Returning the top players that we want to keep
586     return elitePlayers;
587 }
588
589 std::vector<long> startOneGameCicle(Game *game, std::vector<std::vector<long>> &resultVector, int id) {
590     game->playGame();
591     game->cleanUpGame();
592
593     resultVector[id] = game->getOverallGameResults();
594     std::cout << "Thread " << id << "finished game" << std::endl;
595
596     return game->getOverallGameResults();
597 }
598
599
```