

PROJECT

Path Planning

A part of the Self-Driving Car Engineer Program

PROJECT REVIEW

CODE REVIEW 5

NOTES

▼ src/main.cpp 4

```
1 #include <fstream>
 2 #include <math.h>
 3 #include <uWS/uWS.h>
 4 #include <chrono>
 5 #include <iostream>
 6 #include <thread>
 7 #include <vector>
 8 #include "Eigen-3.3/Eigen/Core"
 9 #include "Eigen-3.3/Eigen/QR"
10 #include "json.hpp"
11 #include "spline.h"
12
13 using namespace std;
15 // for convenience
16 using json = nlohmann::json;
18 // For converting back and forth between radians and degrees.
19 constexpr double pi() { return M_PI; }
20 double deg2rad(double x) { return x * pi() / 180; }
21 double rad2deg(double x) { return x * 180 / pi(); }
22
23 // Checks if the SocketIO event has JSON data.
24 // If there is data the JSON object in string format will be returned,
25 // else the empty string "" will be returned.
26 string hasData(string s) {
     auto found_null = s.find("null");
27
     auto b1 = s.find_first_of("[");
28
```

```
auto b2 = s.find first of("}");
29
    if (found null != string::npos) {
30
     return "";
31
    } else if (b1 != string::npos && b2 != string::npos) {
32
     return s.substr(b1, b2 - b1 + 2);
33
34
     return "";
35
36 }
37
38 double distance(double x1, double y1, double x2, double y2)
       return sqrt((x2-x1)*(x2-x1)+(y2-y1)*(y2-y1));
40
41 }
42 int ClosestWaypoint(double x, double y, const vector<double> &maps_x, const vector<dou
43 {
44
       double closestLen = 100000; //large number
45
       int closestWaypoint = 0;
46
47
       for(int i = 0; i < maps_x.size(); i++)</pre>
48
49
           double map x = maps x[i];
50
           double map y = maps y[i];
51
           double dist = distance(x,y,map x,map y);
52
           if(dist < closestLen)</pre>
53
54
               closestLen = dist;
55
               closestWaypoint = i;
56
57
58
       }
59
60
       return closestWaypoint;
61
62
63 }
64
65 int NextWaypoint(double x, double y, double theta, const vector<double> &maps_x, const
66 {
67
       int closestWaypoint = ClosestWaypoint(x,y,maps x,maps y);
68
69
       double map_x = maps_x[closestWaypoint];
70
       double map_y = maps_y[closestWaypoint];
71
72
       double heading = atan2((map_y-y),(map_x-x));
73
74
       double angle = fabs(theta-heading);
75
76
     angle = min(2*pi() - angle, angle);
77
     if(angle > pi()/4)
78
79
       closestWaypoint++;
80
     if (closestWaypoint == maps_x.size())
81
82
       closestWaypoint = 0;
83
     }
84
85
     return closestWaypoint;
87
88 }
```

```
90 // Transform from Cartesian x,y coordinates to Frenet s,d coordinates
 91 vector<double> getFrenet(double x, double y, double theta, const vector<double> &maps
 92 {
        int next wp = NextWaypoint(x,y, theta, maps x,maps y);
 93
 94
        int prev wp;
 95
 96
        prev wp = next wp-1;
 97
        if(next wp == 0)
 98
            prev_wp = maps_x.size()-1;
 99
        }
100
101
102
        double n x = maps x[next wp]-maps x[prev wp];
        double n_y = maps_y[next_wp]-maps_y[prev_wp];
103
        double x_x = x - maps_x[prev_wp];
104
        double x_y = y - maps_y[prev_wp];
105
106
        // find the projection of x onto n
107
        double proj_norm = (x_x*n_x+x_y*n_y)/(n_x*n_x+n_y*n_y);
108
        double proj_x = proj_norm*n_x;
109
        double proj_y = proj_norm*n_y;
110
111
        double frenet_d = distance(x_x,x_y,proj_x,proj_y);
112
113
        //see if d value is positive or negative by comparing it to a center point
114
115
        double center_x = 1000-maps_x[prev_wp];
116
        double center y = 2000-maps y[prev wp];
117
        double centerToPos = distance(center_x,center_y,x_x,x_y);
118
        double centerToRef = distance(center x,center y,proj x,proj y);
119
120
        if(centerToPos <= centerToRef)</pre>
121
122
            frenet d *= -1;
123
124
125
        // calculate s value
126
        double frenet s = 0;
127
        for(int i = 0; i < prev wp; i++)</pre>
128
129
        {
            frenet_s += distance(maps_x[i],maps_y[i],maps_x[i+1],maps_y[i+1]);
130
131
132
        frenet s += distance(0,0,proj x,proj y);
133
134
135
        return {frenet s,frenet d};
136
137 }
138
139 // Transform from Frenet s,d coordinates to Cartesian x,v
140 vector<double> getXY(double s, double d, const vector<double> &maps s, const vector<do
141 {
142
        int prev_wp = -1;
143
        while(s > maps s[prev wp+1] && (prev wp < (int)(maps s.size()-1) ))</pre>
144
145
146
            prev wp++;
        }
147
148
        int wp2 = (prev_wp+1)%maps_x.size();
149
150
```

```
double heading = atan2((maps_y[wp2]-maps_y[prev_wp]),(maps_x[wp2]-maps_x[prev_wp])
151
        // the x,y,s along the segment
152
        double seg_s = (s-maps_s[prev_wp]);
153
154
        double seg_x = maps_x[prev_wp]+seg_s*cos(heading);
155
        double seg y = maps y[prev wp]+seg s*sin(heading);
156
157
        double perp heading = heading-pi()/2;
158
159
        double x = seg x + d*cos(perp heading);
160
        double y = seg y + d*sin(perp heading);
161
162
163
        return {x,y};
164
165 }
166
167 int main() {
     uWS::Hub h;
169
     // Load up map values for waypoint's x,y,s and d normalized normal vectors
170
     vector<double> map waypoints x;
171
     vector<double> map waypoints y;
172
     vector<double> map waypoints s;
173
174
      vector<double> map waypoints dx;
     vector<double> map_waypoints_dy;
175
176
      // Waypoint map to read from
177
      string map_file_ = ".../data/highway_map.csv";
178
      // The max s value before wrapping around the track back to 0
179
      double max s = 6945.554;
180
181
     //Global variable placeholder for intended velocity of car based on constraints, pre
182
183
      double intended velocity = 0.0;
```

AWESOME

well done setting this value to 0.0. This accounts for the safe kickoff of the car during simulation.

```
184
      ifstream in map (map file .c str(), ifstream::in);
185
186
      string line;
187
      while (getline(in_map_, line)) {
188
       istringstream iss(line);
189
        double x;
190
        double y;
191
        float s;
192
        float d_x;
193
        float d y;
194
195
       iss >> x;
       iss >> v;
196
        iss >> s;
197
        iss >> d x;
198
       iss >> d y;
199
        map waypoints x.push back(x);
200
        map waypoints y.push back(y);
201
        map_waypoints_s.push_back(s);
202
        map waypoints dx.push back(d x);
203
```

```
map_waypoints_dy.push_back(d_y);
204
205
206
      h.onMessage([&intended_velocity, &map_waypoints_x,&map_waypoints_y,&map_waypoints_s
207
                         uWS::OpCode opCode) {
208
        // "42" at the start of the message means there's a websocket message event.
209
210
        // The 4 signifies a websocket message
        // The 2 signifies a websocket event
211
        //auto sdata = string(data).substr(0, length);
212
        //cout << sdata << endl;</pre>
213
        if (length && length > 2 && data[0] == '4' && data[1] == '2') {
214
215
216
          auto s = hasData(data);
217
          if (s != "") {
218
            auto j = json::parse(s);
219
220
            string event = j[0].get<string>();
221
222
            if (event == "telemetry") {
223
              // j[1] is the data JSON object
224
225
                // Main car's localization Data
226
227
                double car x = j[1]["x"];
                double car_y = j[1]["y"];
228
                double car s = j[1]["s"];
229
                double car_d = j[1]["d"];
230
                double car_yaw = j[1]["yaw"];
231
                double car_speed = j[1]["speed"];
232
233
                // Previous path data given to the Planner
234
                auto previous_path_x = j[1]["previous_path_x"];
235
                auto previous path y = j[1]["previous path y"];
236
                // Previous path's end s and d values
237
238
                double end path s = j[1]["end path s"];
                double end_path_d = j[1]["end_path_d"];
239
240
                // Sensor Fusion Data, a list of all other cars on the same side of the \ensuremath{\kappa}
241
                auto sensor fusion = j[1]["sensor fusion"];
242
243
                json msgJson;
244
245
                vector<double> next x vals;
246
                vector<double> next y vals;
247
248
249
                //Constants for current simulator environment
                // Width of lane in meters
250
                const double lane width = 4.0;
251
                // Time taken by simulator to travel from current to next waypoint - 20 ms
252
                const double simulator reach time = 0.02;
253
                //Converter to convert velocity from mph to m/s
254
255
                const double velocity mph to ms conv = 1609.344 / 3600;
256
                //Speed limit constraints
257
                //Speed limit
258
                const double safe_speed_limit = 48 * velocity_mph_to_ms_conv;
259
260
                //Minimum speed to ensure path smoother spline library gets coordinates in
                const double minimum_speed_limit = 3 * velocity_mph_to_ms_conv;
261
262
                //Safe distance between cars constraints
263
                //Safe distance ahead of our car
```

```
const int safe range ahead = 30;
265
266
                //Safe distance behind our car. This is used in lane shift
                const int safe_range_behind = 15;
267
268
                //Static variable for intended lane for car.
269
                //1. 0 for leftmost lane
270
                //2. 1 for middle lane
271
                //3. 2 for rightmost lane
272
                static float lane id = 1.0;
273
274
                //Number of waypoints left for previous set of path planner points
275
                int previous size = previous path x.size();
276
277
                //Looking forward in time
278
                if (previous size > 0) {
279
                  car_s = end_path_s;
280
281
282
                /** PREDICTION COMPONENT
283
                  Detects presence of cars ahead in current and ahead and behind in other
284
                  determined distance range
285
286
                //Flag for prediction of cars in current lane of car and other lanes
287
                bool is car ahead = false;
288
                bool is_car_left = false;
289
                bool is car right = false;
290
291
                //Loop in sensor fusion data which has information on location and velocit
292
                for (int i = 0; i < sensor fusion.size(); i++) {</pre>
293
                  double o car vx = sensor fusion[i][3];
294
                  double o car vy = sensor fusion[i][4];
295
                  double o_car_s = sensor_fusion[i][5];
296
                  double o car d = sensor fusion[i][6];
297
                  float o car lane;
298
299
                  if (o_car_d > 0 && o_car_d < lane_width) {</pre>
300
                    o car lane = 0.0;
301
                  } else if (o_car_d > lane_width && o_car_d < (lane_width * 2)) {</pre>
302
                    o car lane = 1.0;
303
                  } else if (o car d > (lane width * 2) && o car d < (lane width * 3)) {
304
                     o car lane = 2.0;
305
                  } else {
306
                    o_{car_lane} = -1.0;
307
                  }
308
```

AWESOME

Nice job here. Impressive logic here to come about smart lane change by ego car in this section.

```
//Not interested if cars are not on the same side of road/divider
309
310
                    if (o car lane == -1) {
                        continue;
311
312
313
                  //Calculate the velocity and predicted Frenet s coordinate of car
314
                  double o car vel = sqrt(pow(o car vx, 2) + pow(o car vy, 2));
315
                  double o_car_s_ahead = o_car_s + (o_car_vel * simulator_reach_time * pre-
316
317
                  //If other car is in the same lane
```

```
if (o car lane == lane id) {
318
320
                     //If car is getting closer than the safe range
                     if ((o_car_s_ahead > car_s) && ((o_car_s_ahead - car_s) < safe_range_a</pre>
321
                       is car ahead = true;
322
                     }
323
                   } //If other car is the lane right of our car
324
                  else if ((o car lane - lane id) == 1) {
325
                     //If car is getting closer than the safe range either from behind or :
326
                         if (((o_car_s_ahead > car_s) && ((o_car_s_ahead - car_s) < safe_r;</pre>
327
                             ((car_s > o_car_s_ahead) && ((car_s - o_car_s_ahead) < safe_ra</pre>
328
                       is car right = true;
329
                     }
330
                     } //If other car is the lane left of our car
331
                  else if ((o_car_lane - lane_id) == -1) {
332
                     //If car is getting closer than the safe range either from behind or :
333
                         if (((o_car_s_ahead > car_s) && ((o_car_s_ahead - car_s) < safe_ra</pre>
334
                         ((car s > o car s ahead) && ((car s - o car s ahead) < safe range
335
                       is car left = true;
336
                     }
337
                  }
338
                 }
339
```

AWESOME

Impressive speed control logic in this section. It was well perceived in this project

```
340
                /** BEHAVIOR PLANNER COMPONENT
341
                  Deducts the correct behavior the car should follow. Following are the de
342
                  1. Continue in current lane and accelerate reaching speed limit
343
                  2. Slow down in current lane in order to avoid collision with car ahead
344
                  3. Change lane to left with current speed if not in leftmost lane
345
                  4. Change lane to right with current speed if not in rightmost lane
346
                */
347
348
                //Car ahead is getting closer
349
                if (is car ahead) {
350
                  //If right lane shift is possible and our car is not in rightmost lane
351
                    if ((!is car right) && (lane id != 2)) {
352
                        lane id += 1;
353
                    } //If left lane shift is possible and our car is not in leftmost lane
354
                  else if ((!is car left) && (lane id != 0)) {
355
                        lane id -= 1;
356
                    } //No lane change is possible, decelerate by 0.5mph or 0.22 m/s
357
                  else {
358
                        intended velocity -= 0.5 * velocity mph to ms conv;
359
360
                } //No car is ahead and the road is clear in current lane, accelerate at (
361
                  else {
362
                    intended velocity += 0.5 * velocity mph to ms conv;
363
364
365
                //Cap the speed of car to safe speed limit slightly less than speed limit
366
                if (intended_velocity >= safe_speed_limit) {
367
                  intended_velocity = safe_speed_limit;
368
                }
369
                //Minimum speed of car is ensured to avoid spline library exception
370
                if (intended velocity <= minimum speed limit) {</pre>
371
                  intended velocity = minimum speed limit;
```

```
}
372
374
                /** PATH SMOOTHER ALGORITHM
375
                  Derives path of car with waypoints ahead in time. This path is then fed
376
                  1. Create anchor points for spline library. Spline takes the anchor point
377
                   2. Feed anchor points to spline and derive waypoints for lookahead dist;
378
                  3. Feed the waypoints to simulator
379
                */
380
381
                //Anchor points for spline in global coordinates
382
                std::vector<double> anchor_x;
383
                std::vector<double> anchor y;
384
385
                //Anchor points for spline in local coordinates
386
                std::vector<double> anchor x local;
387
                std::vector<double> anchor_y_local;
388
389
                //Step 1 - Start point is car's current position or previous path
390
                double current yaw rad;
391
                double tmp_x_1;
392
                double tmp_y_1;
393
394
                double tmp x 2;
                double tmp_y_2;
395
396
                //If more than 2 waypoints passed to simulator in previous iteration are r
397
                // use them to ensure smooth transition to next set of waypoints
398
                if (previous_size > 2) {
399
                  tmp x 2 = previous path x[previous size - 2];
400
                  tmp y 2 = previous path y[previous size - 2];
401
                   tmp x 1 = previous path x[previous size - 1];
402
                   tmp_y_1 = previous_path_y[previous_size - 1];
403
404
                   anchor x.push back(tmp x 2);
405
                   anchor y.push back(tmp y 2);
406
                   anchor x.push back(tmp x 1);
407
                   anchor_y.push_back(tmp_y_1);
408
409
                   current_yaw_rad = atan2(tmp_y_1 - tmp_y_2, tmp_x_1 - tmp_x_2);
410
                 } //Car has almost travelled every waypoint from previous iteration,
411
                // use car's current location and one waypoint backward in time for smooth
412
                else {
413
                   anchor_x.push_back(car_x - cos(car_yaw));
414
                   anchor_y.push_back(car_y - sin(car_yaw));
415
                   anchor x.push back(car x);
416
                   anchor y.push back(car y);
417
                   current yaw rad = deg2rad(car yaw);
418
419
                }
420
                //Step 2 - Set lookahead distance and anchors
421
                //This is 30 meters
422
                double lookahead weight = 30;
423
424
                int num lookahead steps = 3;
425
                //Step 3 - Use car's frenet coordinates to get lookahead frenets and conve
426
                double tmp lookahead s = 0.0;
427
                double tmp lookahead d = 0.0;
428
429
                std::vector<double> tmp global xy;
                for (int i = 0; i < num_lookahead_steps; i++) {</pre>
430
                     tmp lookahead s = car s + ((i + 1) * lookahead weight);
431
                     tmp_lookahead_d = (lane_id * lane_width) + (lane_width/2);
432
                     tmp global xy = getXY(tmp lookahead s, tmp lookahead d, map waypoints
433
```

```
anchor x.push back(tmp global xy[0]);
434
435
                                        anchor_y.push_back(tmp_global_xy[1]);
                                 }
436
437
                                //Step 4 - Convert anchor points to local coordinates in order to feed it
438
                                //generate waypoints along the path to anchor
439
440
                                double tmp_diff_x;
441
                                double tmp diff y;
442
                                double tmp_local_x;
443
                                double tmp local y;
444
445
                                 for (int i = 0; i < anchor x.size(); i++) {
446
                                    //Shift axes
447
                                    tmp diff x = anchor x[i] - anchor x[0];
448
                                     tmp_diff_y = anchor_y[i] - anchor_y[0];
449
450
                                     //Rotate axes
451
                                     tmp local x = tmp diff x * cos(-current yaw rad) - tmp diff y * sin(-cur
452
                                     tmp_local_y = tmp_diff_x * sin(-current_yaw_rad) + tmp_diff_y * cos(-cur
453
454
                                     anchor x local.push back(tmp local x);
455
                                     anchor_y_local.push_back(tmp_local_y);
456
457
458
                                //Step 5 - Initialize a spline and set local anchor points to it
459
                                 tk::spline sp;
460
                                sp.set points(anchor x local, anchor y local);
461
462
                                //Step 7 - Create waypoints in local coordinate system
463
                                // i. Determine the number of waypoints that can fit between 2 anchor poin
464
                                                      using velocity and the lookahead distance
465
                                // ii. Generate x value on the same straight line as vehicle x
466
                                // iii. Determine y value from the spline curve
467
468
                                double minimum_distance_simulator = intended_velocity * simulator_reach_t:
469
                                 int num waypoints = sqrt(pow(lookahead weight, 2) + pow(sp(lookahead weight, 2) + pow(sp(lookahe
470
                                int waypoint_steps = 30;
471
472
                                std::vector<double> waypoints x local;
473
                                std::vector<double> waypoints y local;
474
                                double waypoint x;
475
                                double waypoint y;
476
477
                                 for (int i = 0; i < waypoint steps - previous size; i++) {
478
479
                                    //Rotate axes
                                    waypoint_x = anchor_x_local[1] + (i + 1) * lookahead_weight / num_waypo:
480
                                    waypoint_y = sp(waypoint_x);
481
482
                                     //Shift axes
483
                                    waypoints x local.push back(waypoint x);
484
485
                                    waypoints_y_local.push_back(waypoint_y);
486
487
                                 for (int i = 0; i < previous size; i++) {</pre>
488
                                    next x vals.push back(previous path x[i]);
489
                                    next_y_vals.push_back(previous_path_y[i]);
490
                                 }
491
492
                                //Step 8 - Convert waypoints from local to global coordinates
493
494
```

```
for (int i = 0; i < waypoint steps - previous size; i++) {
495
                  waypoint x = waypoints x local[i] * cos(current yaw rad) - waypoints y :
496
                  waypoint_y = waypoints_x_local[i] * sin(current_yaw_rad) + waypoints_y_.
497
                  waypoint x += anchor x[0];
498
                  waypoint_y += anchor_y[0];
499
500
                  next x vals.push back(waypoint x);
501
                  next y vals.push back(waypoint y);
502
503
504
                msgJson["next x"] = next x vals;
505
                msgJson["next_y"] = next_y_vals;
506
507
                auto msg = "42[\"control\","+ msgJson.dump()+"]";
508
509
                //this_thread::sleep_for(chrono::milliseconds(1000));
510
                ws.send(msg.data(), msg.length(), uWS::OpCode::TEXT);
511
512
            }
513
          } else {
514
            // Manual driving
515
            std::string msg = "42[\"manual\",{}]";
516
            ws.send(msg.data(), msg.length(), uWS::OpCode::TEXT);
517
518
519
520
      });
521
      // We don't need this since we're not using HTTP but if it's removed the
522
      // program
523
      // doesn't compile :-(
524
      h.onHttpRequest([](uWS::HttpResponse *res, uWS::HttpRequest req, char *data,
525
                          size_t, size_t) {
526
        const std::string s = "<h1>Hello world!</h1>";
527
        if (req.getUrl().valueLength == 1) {
528
529
          res->end(s.data(), s.length());
        } else {
530
          // i guess this should be done more gracefully?
531
          res->end(nullptr, 0);
532
533
534
      });
535
      h.onConnection([&h](uWS::WebSocket<uWS::SERVER> ws, uWS::HttpRequest req) {
536
       std::cout << "Connected!!!" << std::endl;</pre>
537
      });
538
539
540
      h.onDisconnection([&h](uWS::WebSocket<uWS::SERVER> ws, int code,
                              char *message, size_t length) {
541
542
        ws.close();
        std::cout << "Disconnected" << std::endl;</pre>
543
      });
544
545
      int port = 4567;
546
      if (h.listen(port)) {
547
      std::cout << "Listening to port " << port << std::endl;</pre>
548
      } else {
549
        std::cerr << "Failed to listen to port" << std::endl;</pre>
550
551
        return -1;
552
      h.run();
553
```

3/12/2018

AWESOME

Great documentation in this section. It goes a long way to improve code readability. Nice practice.

- ▶ README.md 1
- ▶ src/Eigen-3.3/unsupported/Eigen/CXX11/src/Tensor/README.md
- ▶ src/Eigen-3.3/test/bug1213_main.cpp
- ▶ src/Eigen-3.3/demos/mandelbrot/README
- ▶ src/Eigen-3.3/bench/tensors/README
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