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Kidnapped Vehicle

REVIEW

CODE REVIEW 3

HISTORY

▼ src/particle_filter.cpp 3

```
1  /*
2   * particle_filter.cpp
3   *
4   *   Created on: Dec 12, 2016
5   *       Author: Tiffany Huang (Udacity)
6   *   & Laura Le
7   */
8
9  #include <random>
10 #include <algorithm>
11 #include <iostream>
12 #include <numeric>
13 #include <math.h>
14 #include <iostream>
15 #include <sstream>
16 #include <string>
17 #include <iterator>
18
19 #include "particle_filter.h"
20
21 #define EPS 0.00001
22
23 using namespace std;
24
25 static default_random_engine gen;
26
27 void ParticleFilter::init(double x, double y, double theta, double std[]) {
28     // TODO: Set the number of particles. Initialize all particles to first pos
```

```

29 // x, y, theta and their uncertainties from GPS) and all weights to 1.
30 // Add random Gaussian noise to each particle.
31 // NOTE: Consult particle_filter.h for more information about this method
32 num_particles = 100;

```



AWESOME

Great choice for the number of particle filter. 👍

```

33
34 //normal distribution of sensor noise
35 normal_distribution<double> N_x(0, std[0]);
36 normal_distribution<double> N_y(0, std[1]);
37 normal_distribution<double> N_theta(0, std[2]);
38
39 //initiate particles
40 for (int i = 0; i < num_particles; i++){
41     Particle p;
42     p.id = i;
43     p.x = x;
44     p.y = y;
45     p.theta = theta;
46     p.weight = 1.0;
47
48     // add noise
49     p.x += N_x(gen);
50     p.y += N_y(gen);
51     p.theta += N_theta(gen);
52
53     particles.push_back(p);
54 }
55
56 is_initialized=true;
57
58 }
59
60
61 void ParticleFilter::prediction(double delta_t, double std_pos[], double velocity, double yaw_rate)
62 // TODO: Add measurements to each particle and add random Gaussian noise.
63 // NOTE: When adding noise you may find std::normal_distribution and std::random_engine in <random>
64 // http://en.cppreference.com/w/cpp/numeric/random/normal_distribution
65 // http://www.cplusplus.com/reference/random/default_random_engine/
66
67 // define normal distribution for sensor noise
68 normal_distribution<double> N_x_sensor(0, std_pos[0]);
69 normal_distribution<double> N_y_sensor(0, std_pos[1]);
70 normal_distribution<double> N_theta_sensor(0, std_pos[2]);
71
72 for (int i=0; i< num_particles; i++){
73
74     // get new state
75     if (fabs(yaw_rate) < EPS){
76         particles[i].x += velocity * delta_t * cos(particles[i].theta);
77         particles[i].y += velocity * delta_t * sin(particles[i].theta);
78         //yaw rate continue being the same
79     }
80     else{
81         particles[i].x += velocity / yaw_rate * (sin(particles[i].theta + yaw_rate * delta_t) - sin(particles[i].theta));
82         particles[i].y += velocity / yaw_rate * (cos(particles[i].theta) - cos(particles[i].theta + yaw_rate * delta_t));
83         particles[i].theta += yaw_rate * delta_t;
84     }
85 }

```

```

82         particles[i].theta += yaw_rate * delta_t;
83     }
84
85     // add noise
86     particles[i].x += N_x_sensor(gen);
87     particles[i].y += N_y_sensor(gen);
88     particles[i].theta += N_theta_sensor(gen);
89 }
90
91
92 }
93
94
95 void ParticleFilter::dataAssociation(std::vector<LandmarkObs> predicted, std::vector<LandmarkObs> &observations) {
96     // TODO: Find the predicted measurement that is closest to each observed measurement
97     // observed measurement to this particular landmark.
98     // NOTE: this method will NOT be called by the grading code. But you will implement this method and use it as a helper during the updateWeights method
99
100     unsigned int nObservations = observations.size();
101     unsigned int nPredictions = predicted.size();
102
103     for (unsigned int i=0; i< nObservations; i++){
104
105         //get current observation
106         LandmarkObs obs = observations[i];
107
108         // initiate id of landmark from map to be associated with the observation
109         int map_id = -1;
110         double min_distance = numeric_limits<double>::max();
111
112         for (unsigned int j =0; j < nPredictions; j++){
113             LandmarkObs pred = predicted[j];
114
115             // get distance between current observation and landmark
116             double curr_distance = dist(obs.x, obs.y, pred.x, pred.y);
117
118             // find the nearest predicted landmark to current observation
119             if (curr_distance < min_distance){
120                 min_distance = curr_distance;
121                 map_id = pred.id;
122             }
123         }
124
125         // set observation id to the nearest found predicted landmark's id
126         observations[i].id = map_id;
127     }
128 }
129
130
131
132 void ParticleFilter::updateWeights(double sensor_range, double std_landmark[], const std::vector<LandmarkObs> &observations, const Map &map_landmarks) {
133     // TODO: Update the weights of each particle using a multivariate Gaussian distribution
134     // more about this distribution here: https://en.wikipedia.org/wiki/Multivariate_Gaussian_distribution
135     // NOTE: The observations are given in the VEHICLE'S coordinate system. You should transform them into the MAP'S coordinate system. You will need to transform the observations according to the MAP'S coordinate system. You will need to transform the observations according to the MAP'S coordinate system. You will need to transform the observations according to the MAP'S coordinate system.
136     // Keep in mind that this transformation requires both rotation AND translation.
137     // The following is a good resource for the theory:
138     // https://www.willamette.edu/~gorr/classes/GeneralGraphics/Transforms/transforms1d.html
139     // and the following is a good resource for the actual equation to implement the transform:
140     // https://www.willamette.edu/~gorr/classes/GeneralGraphics/Transforms/transforms2d.html
141     // 3.33
142     // http://planning.cs.uiuc.edu/node99.html
143 }

```

```

144
145     for (unsigned i = 0; i < num_particles; i++){
146         double particle_x = particles[i].x;
147         double particle_y = particles[i].y;
148         double particle_theta = particles[i].theta;
149
150         // create vector to store map landa=mark location within sensor range :
151         vector<LandmarkObs> predictions;
152
153         for (unsigned int j = 0; j < map_landmarks.landmark_list.size(); j++){
154             float landmark_x = map_landmarks.landmark_list[j].x_f;
155             float landmark_y = map_landmarks.landmark_list[j].y_f;
156             int landmark_id = map_landmarks.landmark_list[j].id_i;
157
158             double dX = particle_x - landmark_x;
159             double dY = particle_y - landmark_y;
160             double sensor_range_2 = sensor_range * sensor_range;
161
162             // consider only landmark within sensor range
163             if( dX*dX + dY*dY <= sensor_range_2){
164
165                 // add prediction to vector
166                 predictions.push_back(LandmarkObs{landmark_id, landmark_x, landr
167             }
168         }
169
170         //transform observation coordinate from car's to map's
171         vector<LandmarkObs> trans_observations;
172         for (unsigned int j = 0; j < observations.size(); j++) {
173             double transObs_x = cos(particle_theta)*observations[j].x - sin(particle_theta)*observations[j].y;
174             double transObs_y = sin(particle_theta)*observations[j].x + cos(particle_theta)*observations[j].y;
175             trans_observations.push_back(LandmarkObs{ observations[j].id, transObs_x, transObs_y});
176         }
177
178         // perform data association between particle and selected landmark
179         dataAssociation(predictions, trans_observations);
180
181         //reset weights
182         particles[i].weight = 1.0;
183
184         for (unsigned int j=0; j<trans_observations.size(); j++){
185             double obs_x = trans_observations[j].x;
186             double obs_y = trans_observations[j].y;
187
188             double pred_x, pred_y;
189
190             int associated_pred_id = trans_observations[j].id;
191
192             bool found = false;
193             unsigned int k =0;
194             unsigned int pred_sz = predictions.size();
195             while(!found && k < pred_sz){
196                 if(predictions[k].id == associated_pred_id){
197                     found = true;
198                     pred_x = predictions[k].x;
199                     pred_y = predictions[k].y;
200                 }
201                 k++;
202             }
203             //calculate weight for this observation with multivariate gaussian
204             double stdlm_x = std_landmark[0];

```

```

205         double stdlm_y = std_landmark[1];
206         double obs_weight = ( 1/(2*M_PI*stdlm_x*stdlm_y)) * exp( -( pow(pr
207         if(obs_weight < EPS){
208             obs_weight = EPS;
209         }
210         //update particle weight
211         particles[i].weight *= obs_weight;
212     }
213 }
214 }

```



AWESOME

The `updateWeights` code structure is logical, neat and all the methods have been correctly implemented.

```

215
216
217 void ParticleFilter::resample() {
218     // TODO: Resample particles with replacement with probability proportional
219     // NOTE: You may find std::discrete_distribution helpful here.
220     // http://en.cppreference.com/w/cpp/numeric/random/discrete_distribution
221
222     //get weights
223     vector<double> weights;
224     double max_weight = numeric_limits<double>::min();
225     for(int i=0; i< num_particles; i++){
226         weights.push_back(particles[i].weight);
227         if(particles[i].weight > max_weight){
228             max_weight = particles[i].weight;
229         }
230     }
231
232     // create distribution
233     uniform_real_distribution<double> dist_double(0.0, max_weight);
234     uniform_int_distribution<int> dist_int(0, num_particles-1);
235
236     int index= dist_int(gen);
237     double beta = 0.0;
238
239     // create the wheel
240     vector<Particle> resampled_particles;
241     for(int i=0; i<num_particles;i++){
242         beta += dist_double(gen)*2.0;
243         while(beta > weights[index]){
244             beta -= weights[index];
245             index=(index+1)% num_particles;
246         }
247         resampled_particles.push_back(particles[index]);
248     }
249
250     //update particles with the new list of resampled particles
251     particles = resampled_particles;
252 }

```



AWESOME

Resampling algorithm is pythonic 👍

```
253
254
255 Particle ParticleFilter::SetAssociations(Particle& particle, const std::vector<
256                                         const std::vector<double>& sense_x, const
257 {
258     //particle: the particle to assign each listed association, and associatio
259     // associations: The landmark id that goes along with each listed associat
260     // sense_x: the associations x mapping already converted to world coordinat
261     // sense_y: the associations y mapping already converted to world coordinat
262
263     //Clear the previous associations
264     particle.associations.clear();
265     particle.sense_x.clear();
266     particle.sense_y.clear();
267
268     particle.associations= associations;
269     particle.sense_x = sense_x;
270     particle.sense_y = sense_y;
271
272     return particle;
273 }
274
275 string ParticleFilter::getAssociations(Particle best)
276 {
277     vector<int> v = best.associations;
278     stringstream ss;
279     copy( v.begin(), v.end(), ostream_iterator<int>(ss, " "));
280     string s = ss.str();
281     s = s.substr(0, s.length()-1); // get rid of the trailing space
282     return s;
283 }
284 string ParticleFilter::getSenseX(Particle best)
285 {
286     vector<double> v = best.sense_x;
287     stringstream ss;
288     copy( v.begin(), v.end(), ostream_iterator<float>(ss, " "));
289     string s = ss.str();
290     s = s.substr(0, s.length()-1); // get rid of the trailing space
291     return s;
292 }
293 string ParticleFilter::getSenseY(Particle best)
294 {
295     vector<double> v = best.sense_y;
296     stringstream ss;
297     copy( v.begin(), v.end(), ostream_iterator<float>(ss, " "));
298     string s = ss.str();
299     s = s.substr(0, s.length()-1); // get rid of the trailing space
300     return s;
301 }
302
```

► src/particle_filter.h

► src/map.h

- ▶ src/main.cpp
- ▶ src/helper_functions.h
- ▶ ide_profiles/xcode/CMakeFiles/TargetDirectories.txt
- ▶ ide_profiles/xcode/CMakeFiles/3.11.1/CompilerIdCXX/CMakeCXXCompilerId.cpp
- ▶ ide_profiles/xcode/CMakeCache.txt
- ▶ data/map_data.txt
- ▶ cmakepatch.txt
- ▶ README.md
- ▶ CMakeLists.txt

RETURN TO PATH

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