

## プログラム

実行環境と用いた言語・ライブラリを以下の表 1 に示す。

表 1: プログラムの実行環境

OS	: Microsoft Windows 10 Pro (64bit)
CPU	: Intel(R) Core(TM) i5-4300U
RAM	: 4.00 GB
使用言語	: Python3.6
可視化	: matplotlib ライブラリ

### Listings 1: assignment2.py

```
1  # -*- coding: utf-8 -*-
2
3
4  import numpy as np
5  import matplotlib.pyplot as plt
6
7
8  def generate_sample(n):
9      sample = (np.random.randn(n) + np.where(np.random.rand(n) > 0.3, 2.,
10      -2.))
11      return sample
12
13  def gauss_dist(x, mu, sigma):
14      d = mu.shape[0]
15      phi = (1/(2 * np.pi * sigma**2)**(d/2)) * np.exp(-(1/(2*sigma**2) * (x -
16      mu)**2))
17      return phi
18
19  def calc_w_phi(x, w, mu, sigma):
20      phi_list = []
21      m = mu.shape[0]
22      for j_dash in range(m):
23          phi_list.append(gauss_dist(x, mu[j_dash], sigma[j_dash]))
24      phi_list = np.array(phi_list).T
25      w_phi = w * phi_list
26      return w_phi
27
28
29  def gaussian_mixture_model(x, w, mu, sigma):
30      w_phi = calc_w_phi(x, w, mu, sigma)
31      q = np.sum(w_phi, axis=1)
```

```

32     return q
33
34
35 def calc_eta(x, w, mu, sigma):
36     w_phi = calc_w_phi(x, w, mu, sigma)
37     w_phi_sum = w_phi.sum(axis=1)
38     eta = w_phi
39     for j in range(eta.shape[1]):
40         eta[:, j] /= w_phi_sum
41     return eta
42
43
44 def update_w(j, eta):
45     w_new = np.mean(eta[:, j])
46     return w_new
47
48
49 def update_mu(j, eta, x):
50     mu_new = (np.sum(eta[:, j] * x)) / np.sum(eta[:, j])
51     return mu_new
52
53
54 def update_sigma(j, eta, x, mu):
55     d = mu.shape[1]
56     sigma_new_2 = (1/d) * (np.sum(eta[:, j] * (x - mu[j])**2)) /
57     np.sum(eta[:, j])
58     sigma_new = np.sqrt(sigma_new_2)
59     return sigma_new
60
61 def update(x, w, mu, sigma):
62     m = w.shape[0]
63     eta = calc_eta(x, w, mu, sigma)
64     w_new = np.empty_like(w)
65     mu_new = np.empty_like(mu)
66     sigma_new = np.empty_like(sigma)
67     for j in range(m):
68         w_new[j] = update_w(j, eta)
69         mu_new[j] = update_mu(j, eta, x)
70         sigma_new[j] = update_sigma(j, eta, x, mu)
71     return w_new, mu_new, sigma_new
72
73
74 def calc_Q(x, w, mu, sigma):
75     w_phi = calc_w_phi(x, w, mu, sigma)
76     eta = calc_eta(x, w, mu, sigma)
77     Q = np.sum(np.sum(eta * np.log(w_phi), axis=1))

```

```

78     return Q
79
80
81 def train(x, w, mu, sigma, eps=1e-4, n_converge=5, max_iter=100,
82         show_log=True,):
83     n = x.shape[0]
84     QbyN_list = []
85     for idx_iter in range(max_iter):
86         w, mu, sigma = update(x, w, mu, sigma)
87         Q = calc_Q(x, w, mu, sigma)
88         QbyN = Q/n
89         if show_log:
90             print('Iter: {} \t Q: {:.1f} \t Q/n: {:.4f}'.format(idx_iter+1,
91             Q, QbyN))
92         if len(QbyN_list) < n_converge:
93             QbyN_list.append(QbyN)
94         else:
95             QbyN_list = QbyN_list[1:] + [QbyN]
96             if (max(QbyN_list) - min(QbyN_list)) < eps:
97                 break
98     n_iter = idx_iter + 1
99     return w, mu, sigma, n_iter
100
101 def main():
102     # settings
103     n = 10000
104     m = 2
105     d = 1
106     result_path = '../figures/assignment2_result_n{}.png'.format(n)
107     offset = 1.0
108     np.random.seed(0)
109
110     # data
111     sample = generate_sample(n)
112
113     # init params
114     w = np.random.rand(m)
115     w = w / w.sum()
116     mu = (np.random.rand(m, d) - 0.5) * 6
117     sigma = np.random.rand(m)
118
119     print('Init')
120     print('w: {}'.format(w))
121     print('sigma: {}'.format(sigma))
122     print('mu: \n{}'.format(mu))
123     print()

```

```

123
124     # train
125     w, mu, sigma, n_iter = train(
126         sample, w, mu, sigma,
127         eps=1e-4, n_converge=5, max_iter=100,
128         show_log=True,
129     )
130     Q = calc_Q(sample, w, mu, sigma)
131
132     # result
133     print()
134     print('Result')
135     print('n: {} \t Iter: {}'.format(n, n_iter))
136     print('Q: {} \t Q/n: {}'.format(Q, Q/n))
137     print('w: {} (sum = {})'.format(w, w.sum()))
138     print('sigma: {}'.format(sigma))
139     print('mu: \n{}'.format(mu))
140     print()
141
142     # plot
143     x_axis = np.linspace(sample.min()-offset, sample.max()+offset, 100)
144     q = gaussian_mixture_model(x_axis, w, mu, sigma)
145     plt.plot(x_axis, q, color='darkcyan')
146     plt.hist(sample, bins=50, normed=True, color='lightblue')
147     plt.xlabel('$x$')
148     plt.savefig(result_path)
149     plt.show()
150
151
152 if __name__ == '__main__':
153     main()

```