$\frac{ECE-20875}{Homework-10}$

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Question: Run gmm-em.py on data.txt for k = 2,3,4,5,6 using a tolerance = 1. Write out the fitted mixture model formulas px(x) for each k. What do you observe about the log-likelihood?

Answer:

K = 2:

$$\begin{split} P_x(X) &= 0.4705795783666359*N(x \mid 3.1887189775230573\;,\\ 1.6993391855585842\;) + 0.529420421633364*N(x \mid 11.00216752523677\;,\\ 9.562726217189121\;) \end{split}$$

Log-likelihood: -1091.8565606736677

K = 3:

$$\begin{split} P_x(X) &= 0.24912166694205726*N(x \mid 2.027654629380135\;,\\ 0.34397885444855747\;) + 0.2448077902430767*N(x \mid 4.4675208509050135\;,\\ 0.08024393023611451\;) + 0.5060705428148662*N(x \mid 11.315619284187953\;,\\ 7.741562183985081\;) \end{split}$$

Log-likelihood: -999.7635118345282

K = 4:

 $\begin{array}{l} P_x(X) = 0.2501560667245576 * N(x \mid 2.02957992952585 \;,\, 0.3447708276434597 \;) \\ + 0.24984393326038062 * N(x \mid 4.470202987829373 \;,\, 0.08109582116454865 \;) + \\ 0.24962164945931076 * N(x \mid 8.892912170212226 \;,\, 0.3533543949093422 \;) + \\ 0.2503783505557511 * N(x \mid 13.902519769332546 \;,\, 1.5193385690769485 \;) \end{array}$

Log-likelihood: -910.9246936882649

K = 5:

$$\begin{split} P_x(X) &= 0.2501863499084379 * N(x \mid 2.0298245032134132 \;, \\ 0.3452264790042515 \;) \; + 0.24981365008085846 * N(x \mid 4.470253909148835 \;, \\ 0.08108098701022916 \;) + 0.05729870974902365 * N(x \mid 8.727043845173746 \;, \\ 0.30182166408564526 \;) + 0.19233320327688483 * N(x \mid 8.942374156556664 \;, \end{split}$$

0.3580926774219373) + 0.2503680869847951 * N(x | 13.902688621600076, 1.5187012730705338)

Log-likelihood: -910.8393241677736

K = 6:

 $\begin{array}{l} 0.22350958756466713*N(x \mid 1.993645470310374\;,\,0.3328443914755654\;)\;+\;\\ 0.031037572978978797*N(x \mid 2.609159016167419\;,\,0.7764528446628084\;)\;+\;\\ 0.24545284113408494*N(x \mid 4.473299220137845\;,\,0.08044073864497918\;)\;+\;\\ 0.24948077589397516*N(x \mid 8.892473164201851\;,\,0.35312495359798496\;)\;+\;\\ 0.012871024675185498*N(x \mid 13.291403563763962\;,\,1.4886719360347807\;)\;+\;\\ 0.23764819775310847*N(x \mid 13.933109118810618\;,\,1.5096453334216047\;) \end{array}$

Log-likelihood: -912.4968389442097

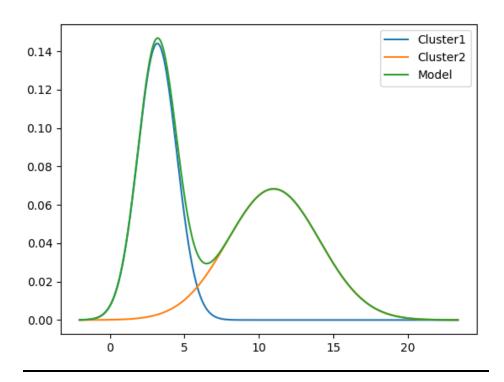
Observation:

In general, a trend in the value of the log-likelihood is observed as K value increases. It is observed from K=2 to 5, the log-likelihood increases. However, at K=6, a slight decrease is observed in the value. However, it is not significant enough.

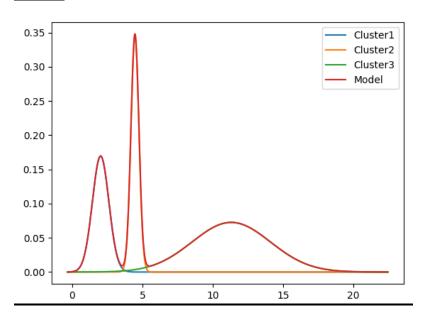
Question 4: Input your results from gmm-em.py for each value of k into gmm-visualize.py. Save your plots turn them in as a part of your writeup. How many clusters does this dataset have ? Explain.

Plots

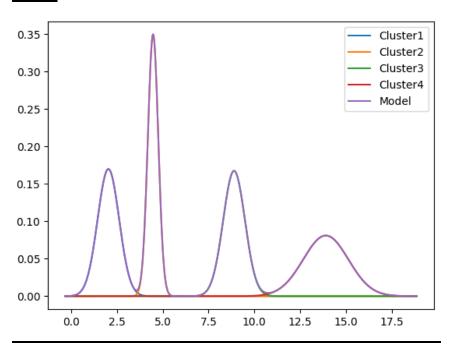
K = 2:



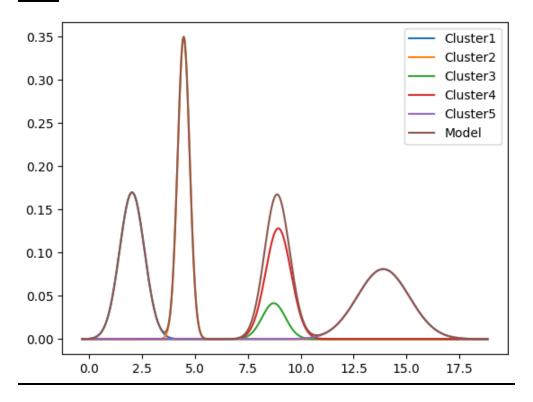
K = 3:



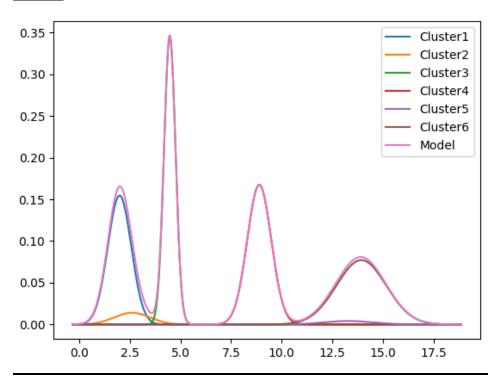
$\underline{\mathbf{K}} = \mathbf{4}$:



<u>K=5:</u>



K = 6:



Observation:

From K = 4 to 5, it is observed that the change in log-likelihoods was less than the tolerance (which in this case is equal to 1). In other words, it is also seen that there is a significant overlap for K = 5 which implies that some Gaussians are invalid. So, it can be inferred that the convergence occurs at K = 4. Therefore, this data set has 4 clusters.