Cystic fibrosis is progressive genetic disease that causes lung infections and breathing difficulties. Individuals are afflicted with cystic fibrosis when they have 2 recessive alleles in the CFTR gene. You are a statistical geneticist interested in estimating population allele frequencies for the dominant allele A and the recessive allele a. You randomly sample 200 research subjects, twelve of which have diagnosed cystic fibrosis. Use an expectation-maximization algorithm to estimate frequencies p_A and p_a . Below are some questions to guide your analysis.

- 1. EM algorithms are often used when there is missing data. What data are you missing?
- 2. Write out the complete data likelihood.
- 3. Write out the incomplete data likelihood.
- 4. Code an EM algorithm in R.
 - (a) Describe the E-step.
 - (b) Describe the M-step.
 - (c) At each iteration, compute the complete data likelihood. End your algorithm when the likelihood stops increasing. Keep track of how many iterations it takes to converge.
 - (d) Report your estimates for the allele frequencies.

Hint 1: Use the print function to confirm that the complete data likelihood increases or stays the same at each iteration.

Hint 2: The invariance property of maximum likelihood estimators implies that $\hat{p}_a = .245$. Hint 3: Assume initial frequencies $p_A = p_a = 1/2$. Try other initializations if time permits.