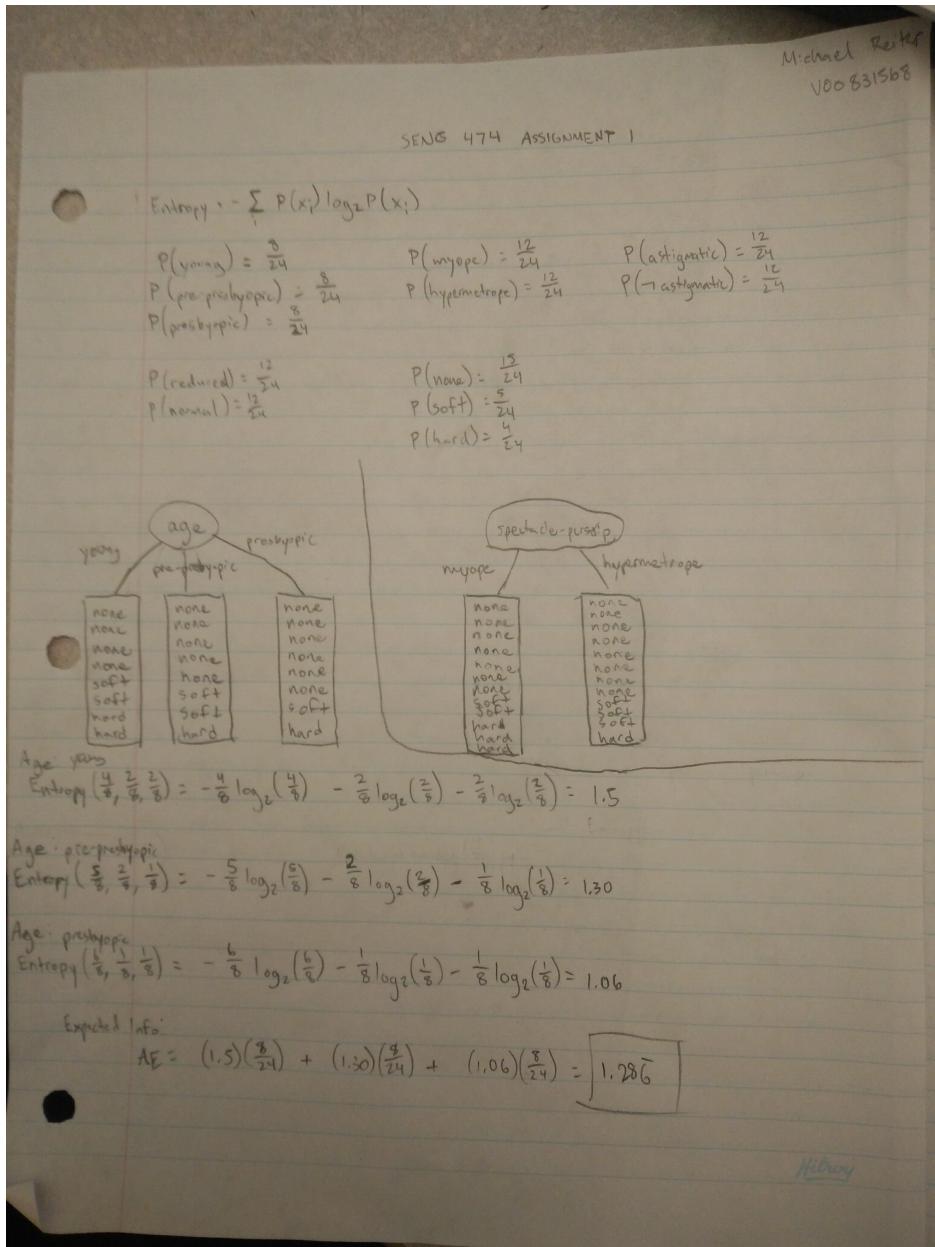
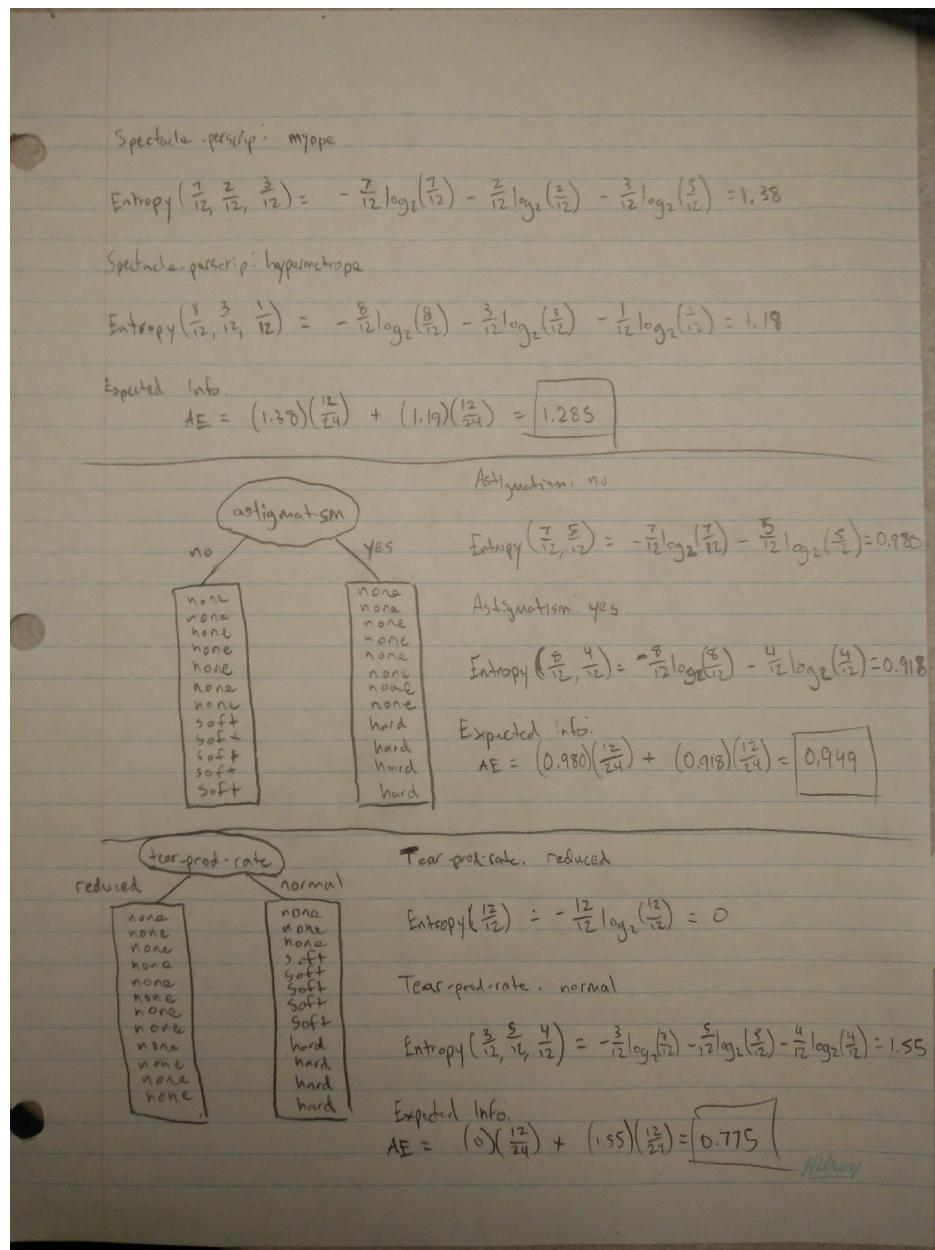
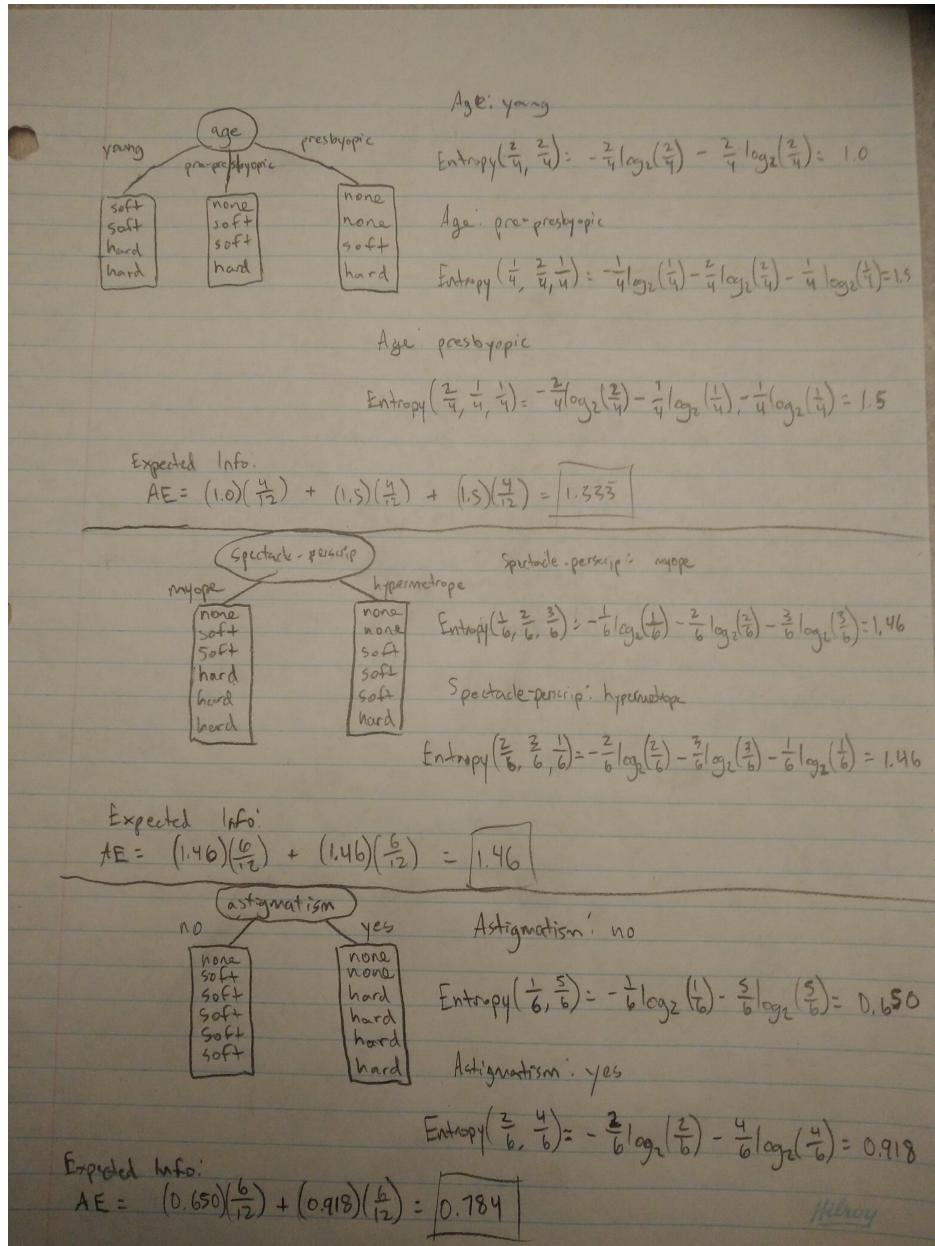


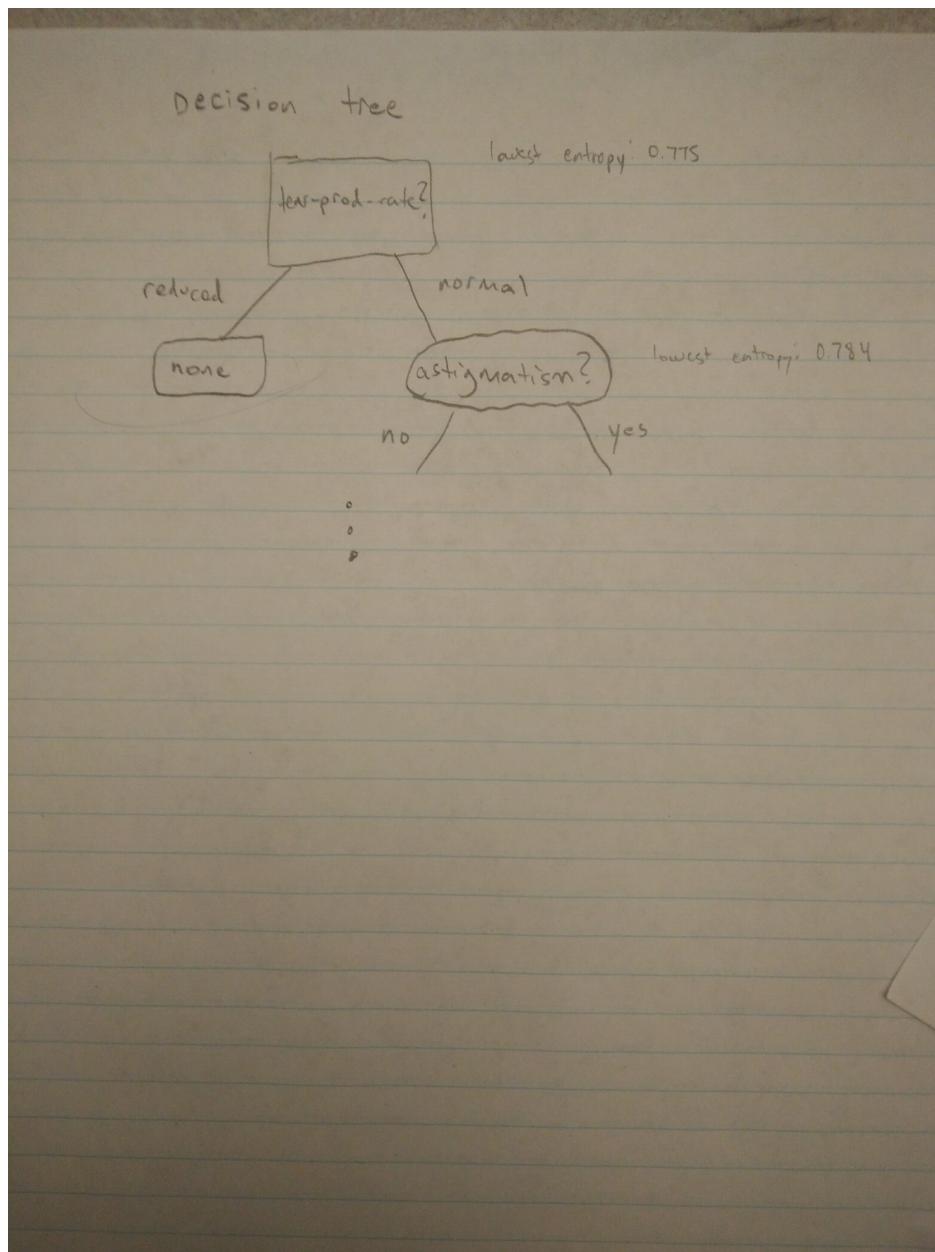
SENG 474 Assignment 1

1. a)

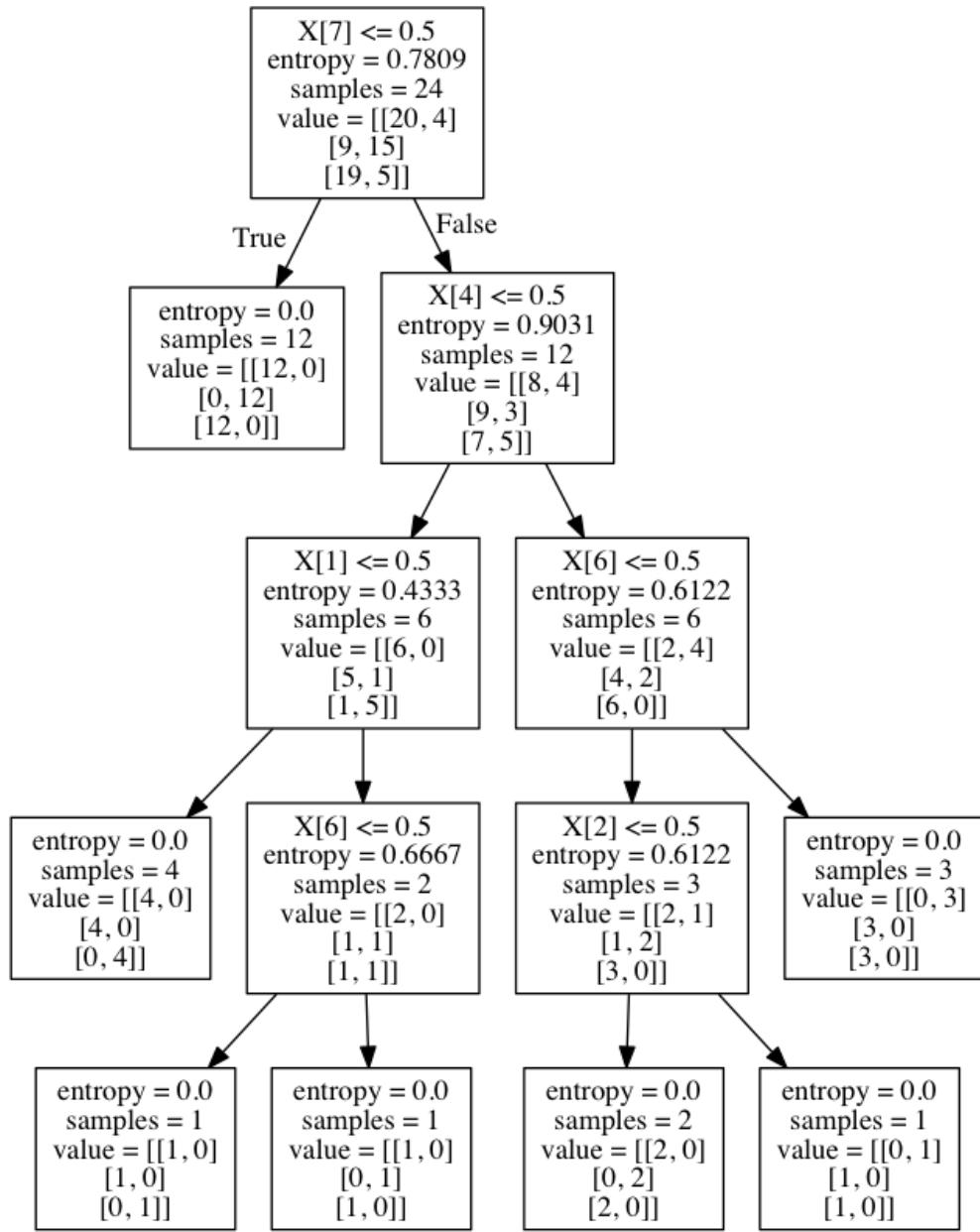








1. b)



This is a decision tree generated by the following code.

```

from util2 import Arff2Skl
from sklearn import tree
cvt = Arff2Skl('contact-lenses.arff')
label = cvt.meta.names()[-1]
X, y = cvt.transform(label)
dtc = tree.DecisionTreeClassifier(criterion='entropy')
dtc.fit(X, y)
tree.export_graphviz(dtc)
  
```

In my tree, the root level entropy was 0.775. In the scikit-learn generated tree, the root level entropy was 0.7809. These trees differ because scikit-learn uses a different algorithm to generate it than I did. I used ID3, but it used CART. Essentially, these algorithms differ in the way they split. CART tries to balance the tree (and ensure it's binary), while ID3 does not.

2.

features	labels
$P(\text{young}) = \frac{5}{24}$	$P(\text{none}) = \frac{15}{24}$
$P(\text{pre-presbyopic}) = \frac{8}{24}$	$P(\text{soft}) = \frac{3}{24}$
$P(\text{presbyopic}) = \frac{8}{24}$	$P(\text{hard}) = \frac{4}{24}$
$P(\text{myope}) = \frac{12}{24}$	
$P(\text{hypermetropic}) = \frac{12}{24}$	
$P(\text{astigmatic}) = \frac{12}{24}$	
$P(\text{non-astigmatic}) = \frac{12}{24}$	
$P(\text{reduced}) = \frac{12}{24}$	
$P(\text{normal}) = \frac{12}{24}$	
	Michael Reiter V00831568
features given labels	
$P(\text{young} \text{none}) = \frac{4}{15}$	$P(\text{myope} \text{none}) = \frac{3}{15}$
$P(\text{young} \text{soft}) = \frac{2}{5}$	$P(\text{myope} \text{soft}) = \frac{2}{5}$
$P(\text{young} \text{hard}) = \frac{2}{4}$	$P(\text{myope} \text{hard}) = \frac{3}{4}$
$P(\text{pre-presbyopic} \text{none}) = \frac{5}{15}$	$P(\text{hypermetropic} \text{none}) = \frac{8}{15}$
$P(\text{pre-presbyopic} \text{soft}) = \frac{2}{5}$	$P(\text{hypermetropic} \text{soft}) = \frac{3}{5}$
$P(\text{pre-presbyopic} \text{hard}) = \frac{1}{4}$	$P(\text{hypermetropic} \text{hard}) = \frac{1}{4}$
$P(\text{non-astigmatic} \text{none}) = \frac{7}{15}$	$P(\text{astigmatic} \text{none}) = \frac{8}{15}$
$P(\text{non-astigmatic} \text{soft}) = \frac{5}{5}$	$P(\text{astigmatic} \text{soft}) = \frac{0}{5}$
$P(\text{non-astigmatic} \text{hard}) = \frac{0}{4}$	$P(\text{astigmatic} \text{hard}) = \frac{9}{4}$
$P(\text{reduced} \text{none}) = \frac{12}{15}$	$P(\text{normal} \text{none}) = \frac{3}{15}$
$P(\text{reduced} \text{soft}) = \frac{0}{5}$	$P(\text{normal} \text{soft}) = \frac{5}{5}$
$P(\text{reduced} \text{hard}) = \frac{9}{4}$	$P(\text{normal} \text{hard}) = \frac{1}{4}$
$P(\text{none} \text{pre-presbyopic, hypermetropic, astigmatic, reduced})$	
$= \alpha P(\text{presbyopic} \text{none}) P(\text{hypermetropic} \text{none}) P(\text{astigmatic} \text{none}) P(\text{reduced} \text{none}) P(\text{none})$	
$= \alpha \left(\frac{5+1}{15+3} \right) \left(\frac{8+1}{15+2} \right) \left(\frac{8+1}{15+2} \right) \left(\frac{12+1}{15+2} \right) \left(\frac{15+1}{24+3} \right) = \boxed{\alpha 0.04233657}$	
$P(\text{soft} \text{pre-presbyopic, hypermetropic, astigmatic, reduced})$	
$= \alpha P(\text{presbyopic} \text{soft}) P(\text{hypermetropic} \text{soft}) P(\text{astigmatic} \text{soft}) P(\text{reduced} \text{soft}) P(\text{soft})$	
$= \alpha \left(\frac{2+1}{5+3} \right) \left(\frac{3+1}{5+2} \right) \left(\frac{0+1}{5+2} \right) \left(\frac{0+1}{5+2} \right) \left(\frac{5+1}{24+3} \right) = \boxed{\alpha 0.000971817}$	
$P(\text{hard} \text{pre-presbyopic, hypermetropic, astigmatic, reduced})$	
$= \alpha P(\text{pre-presbyopic} \text{hard}) P(\text{hypermetropic} \text{hard}) P(\text{astigmatic} \text{hard}) P(\text{reduced} \text{hard}) P(\text{hard})$	
$= \alpha \left(\frac{1+1}{4+3} \right) \left(\frac{1+1}{4+2} \right) \left(\frac{4+1}{4+2} \right) \left(\frac{0+1}{4+2} \right) \left(\frac{4+1}{24+3} \right) = \boxed{\alpha 0.002449539}$	

$$\alpha = \frac{1}{0.042336657 + 0.000971817 + 0.002449539}$$

$$= \frac{1}{0.045758013}$$

$$\text{so } P(\text{none} | \text{evidence}) = \frac{0.042336657}{0.045758013} = 0.925229358$$

$$P(\text{soft} | \text{evidence}) = \frac{0.000971817}{0.045758013} = 0.021238181$$

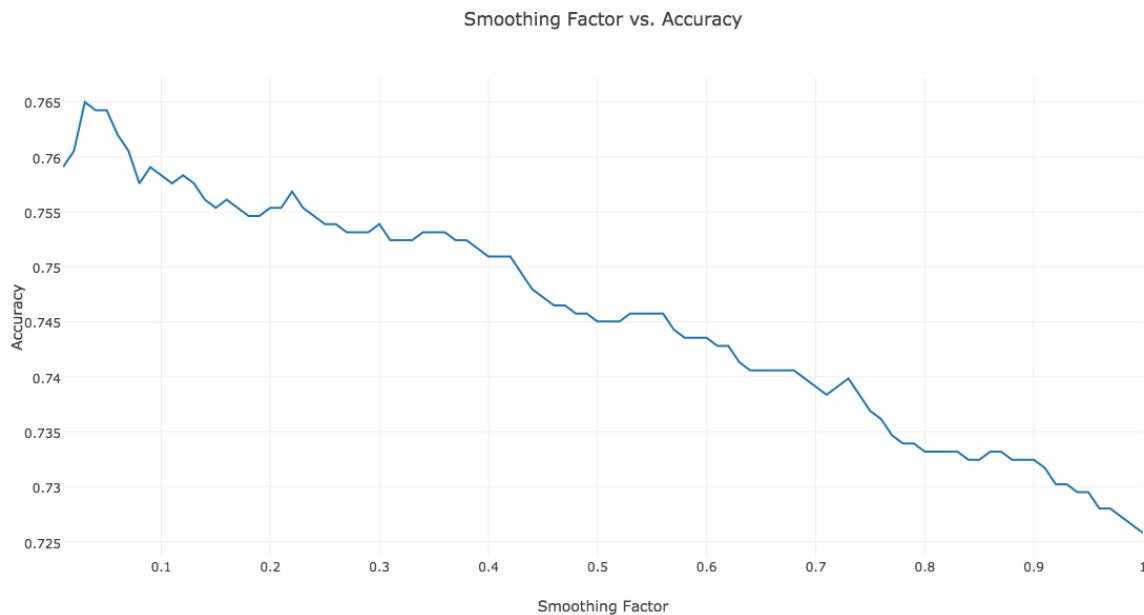
$$P(\text{hard} | \text{evidence}) = \frac{0.002449539}{0.045758013} = 0.053532459$$

therefore none is most likely given the evidence
so "pre-presbyopic, hypermetropic, astigmatic, reduced"
should be classified as none.

3.

a) See uploaded code

b)



This is a plot of smoothing factor (0.01 through 1.0 in increments of 0.01). It is clear that a smoothing factor of 0.03 is optimal. It produces a maximum accuracy of 0.765 given the fetch20_newsgroups dataset included in scikit-learn.