Quiz

Machine Learning System Design

1. You are working on a spam classification system using regularized logistic regression. "Spam" is a positive class (y = 1) and "not spam" is the negative class (y = 0). You have trained your classifier and there are m = 1000 examples in the cross-validation set. The chart of predicted class vs. actual class is:

0 / 1 point

	Actual Class: 1	**Actual Class: 0**
Predicted Class: 1	85	890
Predicted Class: 0	15	10

For reference:

- Accuracy = (true positives + true negatives) / (total examples)
- Precision = (true positives) / (true positives + false positives)
- Recall = (true positives) / (true positives + false negatives)
- F_1 score = (2 * precision * recall) / (precision + recall)

What is the classifier's accuracy (as a value from 0 to 1)?

Enter your answer in the box below. If necessary, provide at least two values after the decimal point.

0.095

Incorrect
The answer you gave is not a number.

2. Suppose a massive dataset is available for training a learning algorithm. Training on a lot of data is likely to give good performance when two of the following conditions hold true. **1 / 1 point**

Which are the two?

- [x] A human expert on the application domain can confidently predict y when given only the features x (or more generally, if we have some way to be confident that x contains sufficient information to predict y accurately).

  ✓ **Correct**
  It is important that the features contain sufficient information, as otherwise no amount of data can solve a learning problem in which the features do not contain enough information to make an accurate prediction.

- [ ] The classes are not too skewed.

- [x] Our learning algorithm is able to represent fairly complex functions (for example, if we train a neural network or other model with a large number of parameters).

  ✓ **Correct**
  You should use a complex, "low bias" algorithm, as it will be able to make use of the large dataset provided. If the model is too simple, it will underfit the large training set.

- [ ] When we are willing to include high order polynomial features of x (such as x_1^2, x_2^2, $x_1 x_2$, etc.).

3. Suppose you have trained a logistic regression classifier which is outputting $h_\theta(x)$. 1 / 1 point

Currently, you predict 1 if $h_\theta(x) \geq \text{threshold}$, and predict 0 if $h_\theta(x) < \text{threshold}$, where currently the threshold is set to 0.5.

Suppose you **increase** the threshold to 0.7. Which of the following are true? Check all that apply.

- [x] The classifier is likely to now have lower recall.

  ✓ **Correct**
  Increasing the threshold means more y = 0 predictions. This will increase the decrease of true positives and increase the number of false negatives, so recall will decrease.

- [ ] The classifier is likely to have unchanged precision and recall, but higher accuracy.
- [ ] The classifier is likely to now have lower precision.
- [ ] The classifier is likely to have unchanged precision and recall, but lower accuracy.

4. Suppose you are working on a spam classifier, where spam emails are positive examples ($y = 1$) and non-spam emails are negative examples ($y = 0$). You have a training set of emails in which 99% of the emails are non-spam and the other 1% is spam. Which of the following statements are true? Check all that apply. 1 / 1 point

- [x] If you always predict spam (output $y = 1$), your classifier will have a recall of 100% and precision of 1%.

  ✓ **Correct**
  Since every prediction is y = 1, there are no false negatives, so recall is 100%. Furthermore, the precision will be the fraction of examples with are positive, which is 1%.

- [ ] If you always predict spam (output $y = 1$), your classifier will have a recall of 0% and precision of 99%.

- [x] If you always predict non-spam (output $y = 0$), your classifier will have a recall of 0%.

Correct
Since every prediction is y = 0, there will be no true positives, so recall is 0%.

- [x] If you always predict non-spam (output $y = 0$), your classifier will have an accuracy of 99%.

Correct
Since 99% of the examples are y = 0, always predicting 0 gives an accuracy of 99%. Note, however, that this is not a good spam system, as you will never catch any spam.

5. Which of the following statements are true? Check all that apply. **1 / 1 point**

- [x] On skewed datasets (e.g., when there are more positive examples than negative examples), accuracy is not a good measure of performance and you should instead use F_1 score based on the precision and recall.

Correct
You can always achieve high accuracy on skewed datasets by predicting the most the same output (the most common one) for every input. Thus the F_1 score is a better way to measure performance.

- [x] Using a **very large** training set makes it unlikely for model to overfit the training data.

Correct
A sufficiently large training set will not be overfit, as the model cannot overfit some of the examples without doing poorly on the others.

- [ ] It is a good idea to spend a lot of time collecting a **large** amount of data before building your first version of a learning algorithm.
- [ ] After training a logistic regression classifier, you **must** use 0.5 as your threshold for predicting whether an example is positive or negative.
- [ ] If your model is underfitting the training set, then obtaining more data is likely to help.