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CS 4375

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ML Algorithms from Scratch

```
The file is opened.
"","pclass","survived","sex","age"
The data has been read from the file.
The file is closed.

Weights
w0: 1.08635
w1: 2.48586

Confusion matrix
pP pN
aP 88 35
aN 18 113

Training time: 39348 milliseconds (39.348 seconds)
Accuracy: 0.784553
Sensitivity: 0.695552
Specificity: 0.862595

C:\Users\Lem\source\repos\cs4375hw3oof\Debug\cs4375hw3oof.exe (process 35748) exited with code 0.
To automatically close the console when debugging stops, enable Tools->Options->Debugging->Automatically close the console when debugging stops.
Press any key to close this window . . .
```

```
Microsoft Visual Studio Debug Console
The file is opened.
"","pclass","survived","sex","age"
The data has been read from the file.
The file is closed.
Prior probabilities
perished survived
.
0.61
Pclass likelihoods
   1st 2nd 3rd
0.172131 0.22541 0.602459
   0.416667 0.262821 0.320513
 ex likelihoods
      female
                     male
   Age means and variances
   Mean Variance
30.3914 204.73
28.8077 209.316
 Raw probabilities [1 -> 5]
     probabilities [1 -> perished survived 0.497087 0.502913 0.6309 0.3691 0.663832 0.336168 0.428545 0.571455 0.389736 0.610264
 Confusion matrix
    pP pN
80 35
Training time: 2753 microseconds (2.753 milliseconds)
Accuracy: 0.784553
Sensitivity: 0.695652
Specificity: 0.862595
C:\Users\Lem\source\repos\cs4375hw3\Debug\cs4375hw3.exe (process 4780) exited with code 0.
To automatically close the console when debugging stops, enable Tools->Options->Debugging->Automatically close the conso
le when debugging stops.
Press any key to close this window . . .
```

Both models produced identical results and metrics, but the naïve Bayes model was dramatically quicker, computing in a couple milliseconds when the logistic regression model took dozens of seconds to achieve the same accuracy. The naïve Bayes assumption that all factors are independent could be responsible for this, as the training ultimately reduces to finding either the likelihoods or the mean and variance of each factor and so for a model with only three factors iterates through less loops than logistic regression by multiple orders of magnitude.

Naïve Bayes is an example of generative classification. Generative classification is designed to understand all classes known in the domain before assigning an observation to one of

the classes based on closest match. It is especially useful on smaller datasets, and takes less work to implement. However, it can also be inefficient because it will compare an observation against every class to find the best match, which spends longer and longer amounts of time with increasingly multiclassed classification regardless of how strongly an observation aligns with one class.

Logistic regression is an example of discriminative classification. Discriminative classification is designed to directly find the class of an observation based on the differences between classes. Although it is more work to implement, discriminative classification is more accurate on larger datasets. Also, like in the case of logistic regression where an observation is plugged into a standardized model, this style of classification is more efficient as it compares only the differences between classes to where an observation sits relative to a boundary condition.

Reproducibility in machine learning is the capacity of a study to be repeated with the same materials to produce the same results. It's very important as it not only validates the findings of a study but provides transparency into the inner mechanisms of what is being studied. It proves a study to be reliable. Types of reproducibility include methods reproducibility, which emphasizes the replication of the procedures, data, and tools to produce the same results, results reproducibility, which emphasizes the replication of the results for following the same experimental procedures, and inferential reproducibility, which emphasizes an agreement in findings from either an independent study or a peer review.

References

- S. N. Srihari, "Machine Learning: Generative and Discriminative Models," in *Introduction to Machine Learning: Course Materials*.
- Z. Ding, A. Reddy, and A. Joshi, "5 Reproducibility," MLCMU, 31-Aug-2020. .