

# IT3105 - Exercise 1

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# 1 Results

## 1.1 pen-digits

| Classifiers         | Average               | St.Dev                  | Test Error |
|---------------------|-----------------------|-------------------------|------------|
| 1 NBC               | 0.11                  | 0.0                     | 0.13       |
| 1 DTC               | 0.00                  | 0.0                     | 0.12       |
| 5 NBC               | 0.07                  | 0.0                     | 0.14       |
| 10 NBC              | 0.07                  | 0.0                     | 0.21       |
| 20 NBC              | 0.07                  | 0.0                     | 0.23       |
| 5 DTC, $depth = A$  | 0.0                   | 0.0                     | 0.13       |
| 10 DTC, $depth = 1$ | 0.64                  | 0.0                     | 0.65       |
| 10 DTC, $depth = 2$ | 0.309                 | 0.003                   | 0.31       |
| 10 DTC, $depth = A$ | 0.0                   | 0.0                     | 0.12       |
| 20 DTC, $depth = A$ | 0.0                   | 0.0                     | 0.13       |
| 5 NBC, 5 DTC        | $\frac{0.138}{0.308}$ | $\frac{0.0228}{0.0045}$ | 0.31       |
| 10 NBC, 10 DTC      | $\frac{0.16}{0.30}$   | $\frac{0.0323}{0.0}$    | 0.32       |
| 20 NBC, 20 DTC      | $\frac{0.18}{0.30}$   | $\frac{0.0251}{0.0}$    | 0.31       |

## 1.2 nursery

| Classifiers         | Average              | St.Dev               | Test Error |
|---------------------|----------------------|----------------------|------------|
| 1 NBC               | 0.09                 | 0.0                  | 0.10       |
| 1 DTC               | 0.00                 | 0.0                  | 0.02       |
| 5 NBC               | 0.148                | 0.0363               | 0.17       |
| 10 NBC              | 0.197                | 0.0549               | 0.24       |
| 20 NBC              | 0.164                | 0.0176               | 0.18       |
| 5 DTC, $depth = A$  | 0.0                  | 0.0                  | 0.02       |
| 10 DTC, $depth = 1$ | 0.29                 | 0.0                  | 0.29       |
| 10 DTC, $depth = 2$ | 0.17                 | 0.0                  | 0.16       |
| 10 DTC, $depth = A$ | 0.00                 | 0.0                  | 0.02       |
| 20 DTC, $depth = A$ | 0.0                  | 0.0                  | 0.02       |
| 5 NBC, 5 DTC        | $\frac{0.144}{0.17}$ | $\frac{0.0321}{0.0}$ | 0.18       |
| 10 NBC, 10 DTC      | $\frac{0.158}{0.17}$ | $\frac{0.0239}{0.0}$ | 0.17       |
| 20 NBC, 20 DTC      | $\frac{0.247}{0.17}$ | $\frac{0.0715}{0.0}$ | 0.16       |

### 1.3 page-blocks

| Classifiers         | Average               | St.Dev               | Test Error |
|---------------------|-----------------------|----------------------|------------|
| 1 NBC               | 0.07                  | 0.0                  | 0.08       |
| 1 DTC               | 0.04                  | 0.0                  | 0.06       |
| 5 NBC               | 0.068                 | 0.004                | 0.08       |
| 10 NBC              | 0.076                 | 0.007                | 0.09       |
| 20 NBC              | 0.064                 | 0.022                | 0.09       |
| 5 DTC, $depth = A$  | 0.05                  | 0.0                  | 0.05       |
| 10 DTC, $depth = 1$ | 0.08                  | 0.0                  | 0.09       |
| 10 DTC, $depth = 2$ | 0.07                  | 0.0                  | 0.08       |
| 10 DTC, $depth = A$ | 0.04                  | 0.0                  | 0.06       |
| 20 DTC, $depth = A$ | 0.04                  | 0.0                  | 0.07       |
| 5 NBC, 5 DTC        | $\frac{0.066}{0.04}$  | $\frac{0.0167}{0.0}$ | 0.06       |
| 10 NBC, 10 DTC      | $\frac{0.075}{0.07}$  | $\frac{0.007}{0.0}$  | 0.08       |
| 20 NBC, 20 DTC      | $\frac{0.0765}{0.08}$ | $\frac{0.006}{0.0}$  | 0.08       |

### 1.4 glass

| Classifiers         | Average               | St.Dev                  | Test Error |
|---------------------|-----------------------|-------------------------|------------|
| 1 NBC               | 0.2                   | 0.0                     | 0.53       |
| 1 DTC               | 0.07                  | 0.0                     | 0.44       |
| 5 NBC               | 0.302                 | 0.0715                  | 0.47       |
| 10 NBC              | 0.261                 | 0.0223                  | 0.58       |
| 20 NBC              | 0.289                 | 0.0223                  | 0.65       |
| 5 DTC, $depth = A$  | 0.09                  | 0.0                     | 0.47       |
| 10 DTC, $depth = 1$ | 0.50                  | 0.0                     | 0.60       |
| 10 DTC, $depth = 2$ | 0.291                 | 0.003                   | 0.51       |
| 10 DTC, $depth = A$ | 0.06                  | 0.0                     | 0.35       |
| 20 DTC, $depth = A$ | 0.08                  | 0.0                     | 0.44       |
| 5 NBC, 5 DTC        | $\frac{0.23}{0.418}$  | $\frac{0.0255}{0.0716}$ | 0.60       |
| 10 NBC, 10 DTC      | $\frac{0.308}{0.445}$ | $\frac{0.0316}{0.0474}$ | 0.42       |
| 20 NBC, 20 DTC      | $\frac{0.325}{0.32}$  | $\frac{0.0390}{0.0}$    | 0.56       |

## 1.5 yeast

| Classifiers                     | Average      | St.Dev        | Test Error |
|---------------------------------|--------------|---------------|------------|
| 1 NBC                           | 0.36         | 0.0           | 0.42       |
| 1 DTC                           | 0.19         | 0.0           | 0.52       |
| 5 NBC                           | 0.424        | 0.0391        | 0.49       |
| 10 NBC                          | 0.423        | 0.0279        | 0.53       |
| 20 NBC                          | 0.483        | 0.0492        | 0.48       |
| 5 DTC, <i>depth</i> = <i>A</i>  | 0.18         | 0.0           | 0.54       |
| 10 DTC, <i>depth</i> = 1        | 0.58         | 0.0           | 0.36       |
| 10 DTC, <i>depth</i> = 2        | 0.49         | 0.0           | 0.54       |
| 10 DTC, <i>depth</i> = <i>A</i> | 0.17         | 0.0           | 0.58       |
| 20 DTC, <i>depth</i> = <i>A</i> | 0.19         | 0.0           | 0.53       |
| 5 NBC, 5 DTC                    | <u>0.428</u> | <u>0.0676</u> | 0.53       |
|                                 | 0.51         | 0.0           |            |
| 10 NBC, 10 DTC                  | <u>0.437</u> | <u>0.0352</u> | 0.51       |
|                                 | 0.49         | 0.0           |            |
| 20 NBC, 20 DTC                  | <u>0.472</u> | <u>0.042</u>  | 0.52       |
|                                 | 0.48         | 0.0           |            |

## 2 Analysis

We will here go through the dataset and point out some of the interesting trends that occurs.

In section 1.1 on page 3 looking at the *pen-digits* dataset we see an interesting trend in that it seems like one *NBC* classifier works better then twenty classifier. This also occurs in nursery and yeast. A reason for this might be overfitting of the later classifiers, which might occur when our learner starts to memorize trainingdata instead of generalizing from trend <sup>1</sup>.

As cited by Alexander Vezhnevets and Olga Barinove, "... overfitting is induced by fitting so called 'confusing samples', that are samples misclassified by 'perfect' Bayesian classifier. Overfitting in boosting seems to occur only when target distributions overlap or the noise is present ..."<sup>2</sup>

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<sup>1</sup>Wikipedia, Overfitting\_(Machine\_learning)

<sup>2</sup><http://www.inf.ethz.ch/personal/vezhneva/Pubs/AvoidingBoostingOverfitting.pdf>